

Exploring Asian North American (ANA) English: A YouTube Corpus-based Approach

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Motivation from Perception: “Sounding Asian”

Some listeners can correctly identify some local “Asian American” speakers at rates above chance

(Hanna, 1997; Newman & Wu, 2011; Wong & Babel, 2017; Cheng & Cho, 2021)

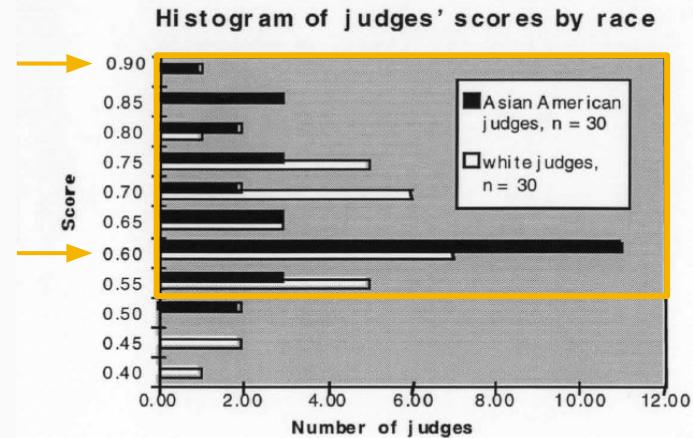


Figure 2. Histogram showing each judge group's score on the Asian American identification test by percentage. (For Asian American judges, $n = 30$, $\mu = 67\%$, $\sigma = 11\%$. For white judges, $n = 30$, $\mu = 63\%$, $\sigma = 10\%$.)

Motivation from Production: ANA Ethnolinguistic Markers

Bauman (2016):

- Members of Asian American-interest sorority in New Jersey (mid-Atlantic region)
- **Some phonetic features interpreted to index local pan-ethnic Asian identity:**
 - Backed /ou/
 - Monophthongal /ou/
 - Lower vowel durational variability (“syllable-timed rhythm”)

Motivation from Production: ANA Ethnolinguistic Markers

- **No consistent differences found across ethnic/racial groups** (Newman & Wu, 2011)
 - E.g., Chinese and Korean American women did not differ from other ethnic groups in vocalic durational variability
- **Variation across specific ANA ethnic groups** (Cheng et al., 2016)
 - E.g., In California, Korean Americans retracted /ʊ/ while Chinese Americans fronted /ʊ/

Research Objective

- Exploratory study to extend previous studies of ANA ethnolinguistic variation
- Clustering analysis on several ANA-associated phonetic features from a sample Asian American-identified YouTubers

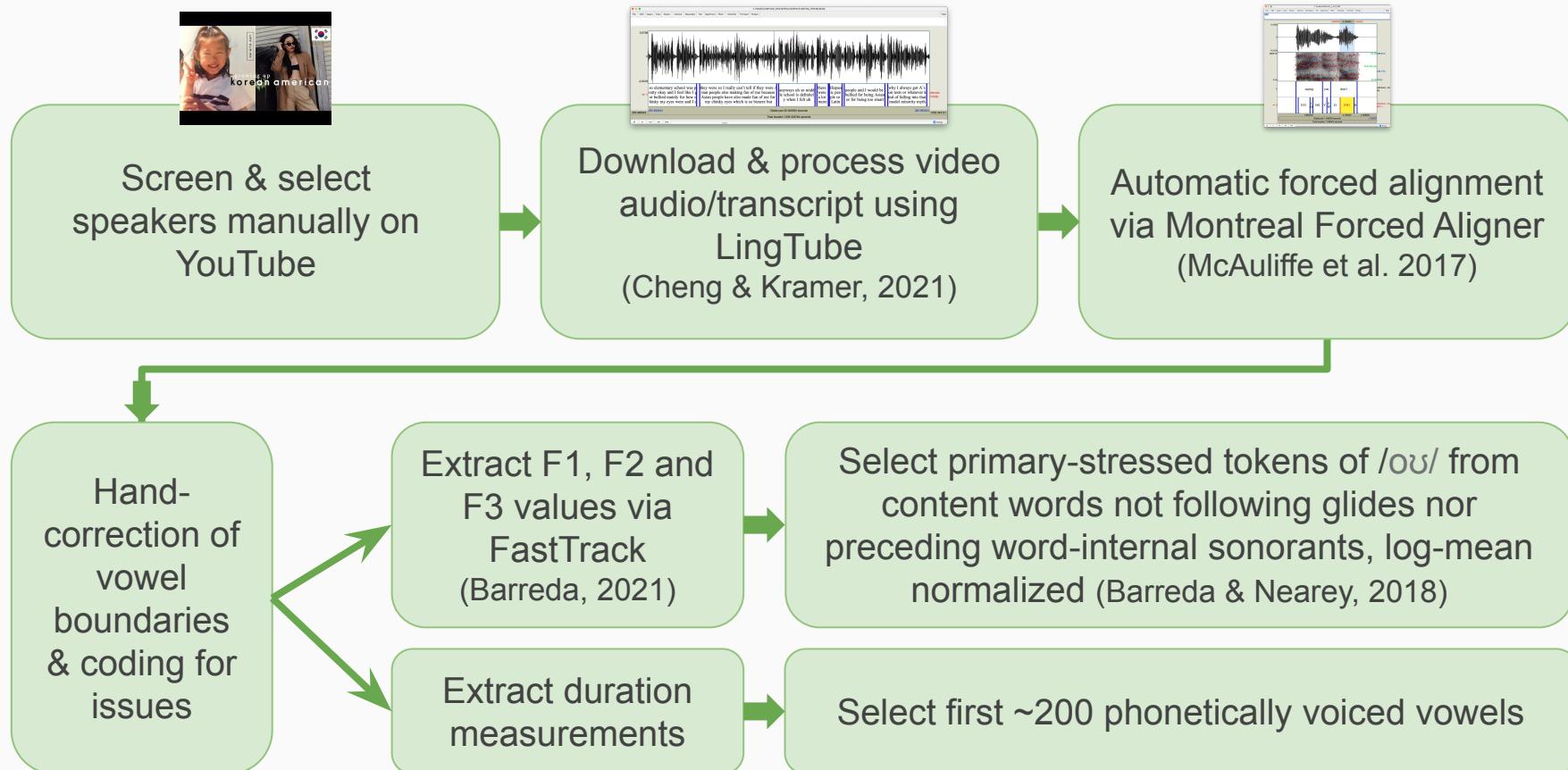
Methods: Speakers/Videos

17 speakers (14 ANA, 3 non-ANA)

- Identified mainly via Asian American topic videos (e.g., Growing up Asian American tag), or general Q&A/Get to Know Me tag videos
- All grew up in California, and present as women
- Where possible, speech samples came from videos on Asian American topics

| Code | Ethnicity | n |
|------|---------------------|---|
| chi | Chinese American | 4 |
| kor | Korean American | 5 |
| eas | Other East Asian | 2 |
| viet | Vietnamese American | 3 |
| non | Non-Asian American | 3 |

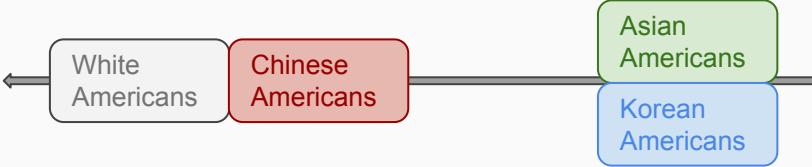
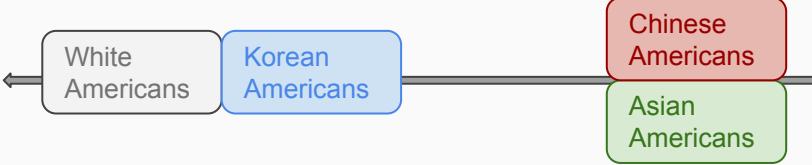
Methods: Data collection and processing



Methods: Phonetic Measures

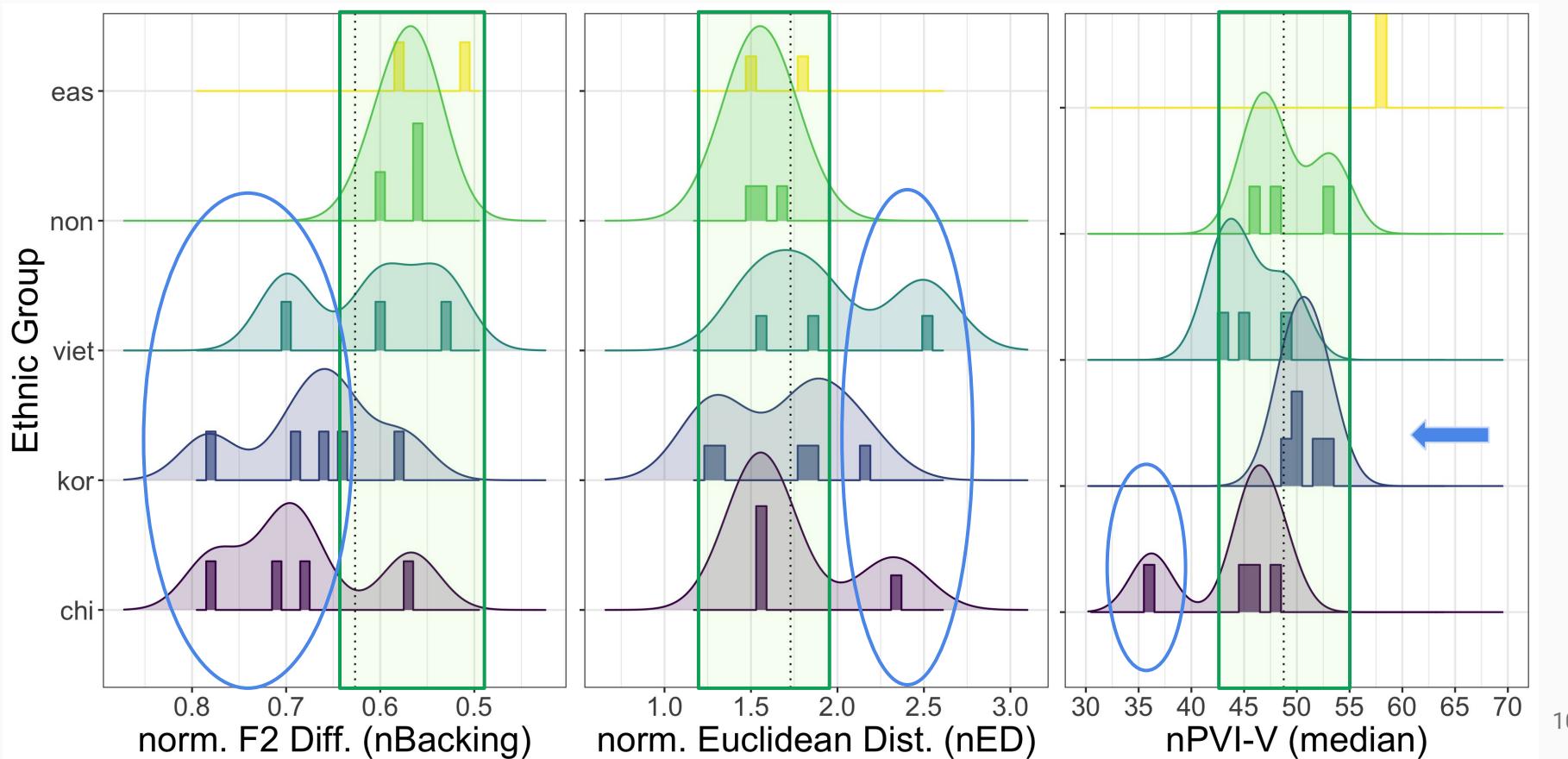
| Feature | Measure |
|-------------------------|--|
| /ou/-Backing | Norm. F2 difference (nBacking): difference in /ou/ F2 from mean /i/ F2 (higher = more back) |
| /ou/-monophthongization | Norm. Euclidean distance (nED): ED of F1+F2 values at ~25% and ~75%, divided by token duration (in seconds) (lower = more monophthongal) |
| Prosodic rhythm | Norm. pairwise variability index (nPVI): Average (median) duration difference between pairs of consecutive vowels, divided by mean pair duration (lower = less dur. variability) |

Methods: Predictions

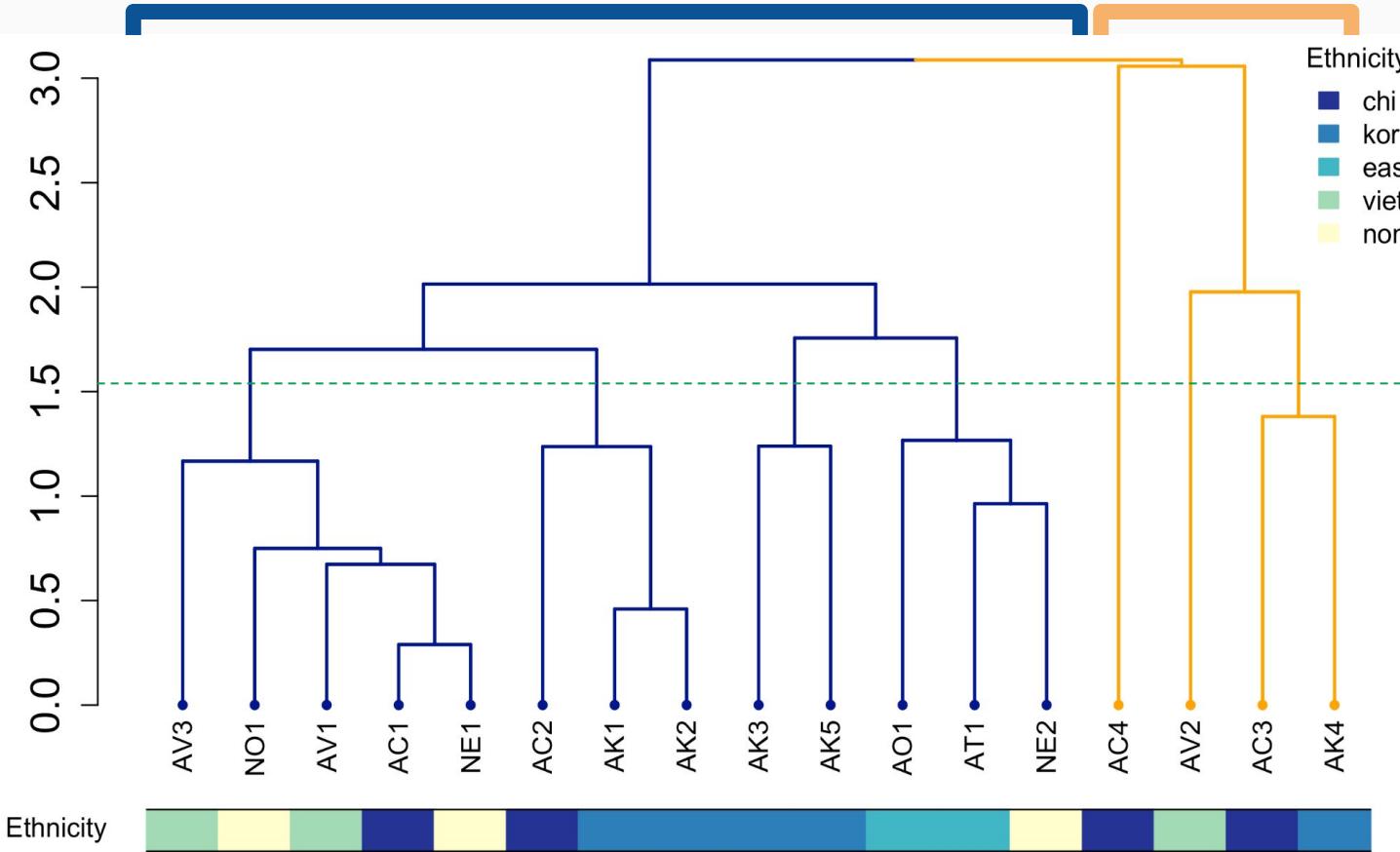
| Feature | Prediction |
|-------------------------|---|
| /ou/-Backing | <p>Fronted (higher F2)</p>  <p>White Americans → Chinese Americans → Asian Americans → Korean Americans → Retracted (lower F2)</p> |
| /ou/-monophthongization | <p>Diphthongal (more formant movement)</p>  <p>White Americans ← Asian Americans → Monophthongal (less formant movement)</p> |
| Prosodic rhythm | <p>'Stress-timed' (more variable vowel durations)</p>  <p>White Americans ← Korean Americans → Chinese Americans → Asian Americans → 'Syllable-timed' (less variable vowel durations)</p> |

Bauman (2016); Hall-Lew (2009); Cheng et al. (2016); Jeon (2017); A. Cheng (2020); D'Onofrio & Van Hofswegen (2020); Newman & Wu (2011); Zipp & Staicov (2016)

Results: Score Distributions by Ethnicity

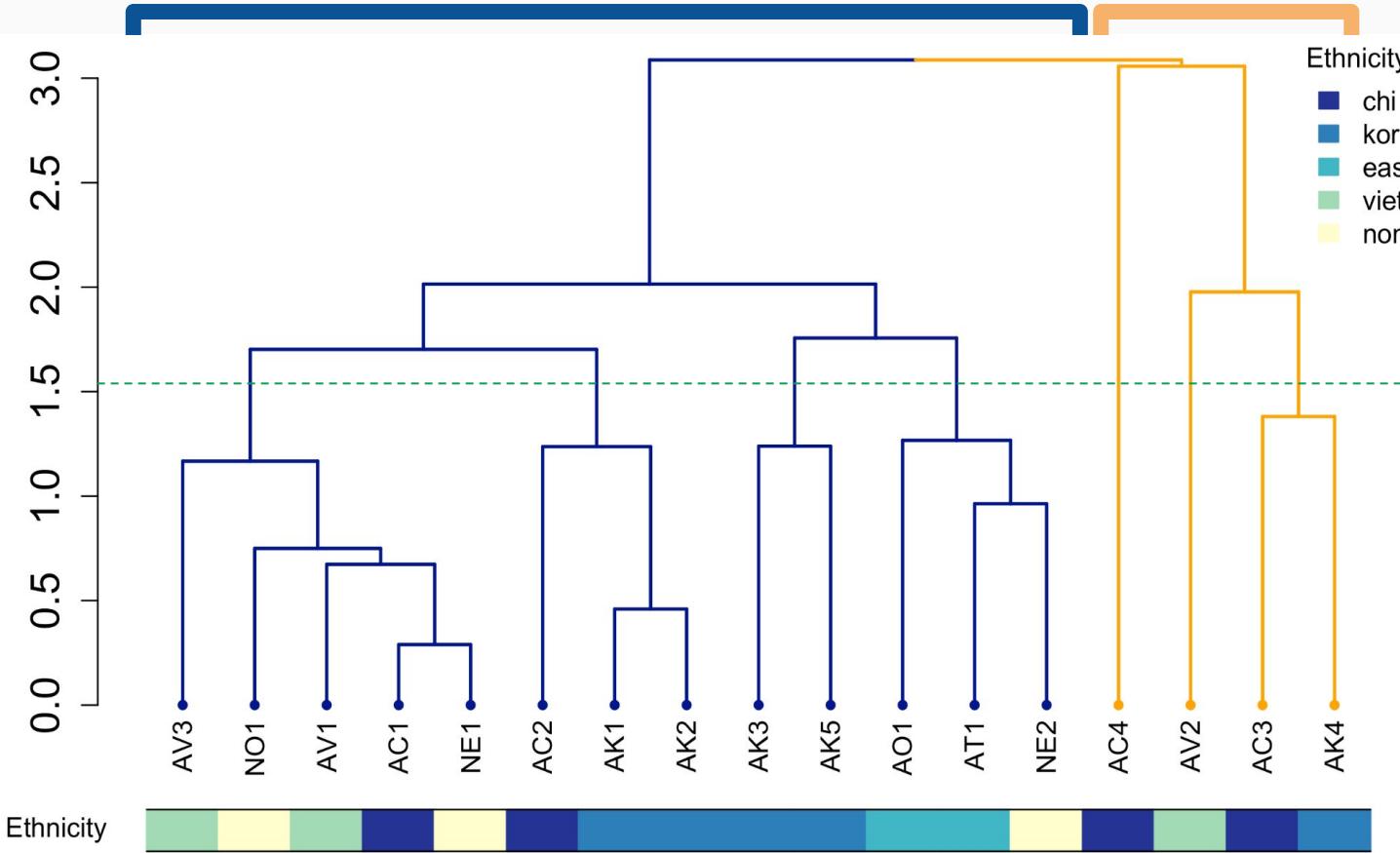


Results: Hierarchical Clustering Analysis (n=17)



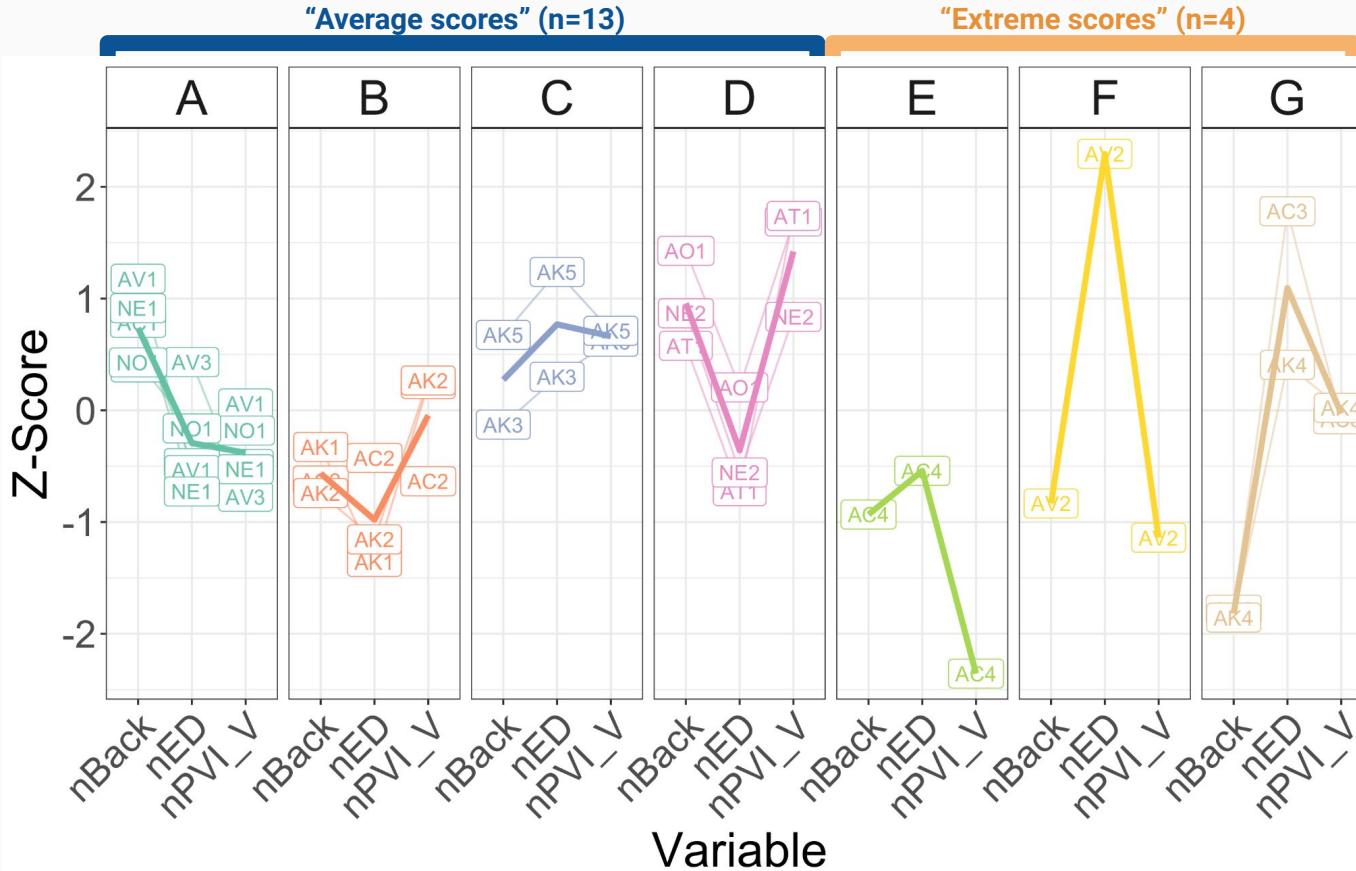
- Three scores per speaker submitted to hierarchical agglomerative clustering (average-linkage method on Euclidean distances)

Results: Hierarchical Clustering Analysis (n=17)



- Clusters are not clearly well-aligned with ethnicity
- But, some patterns could prove to be consistent given a larger dataset

Results: Hierarchical Clustering Analysis (n=17)



- All speakers with extreme scores are ANAs, and have relatively back /ou/
- All 3 non-ANA speakers (in A & D) have average scores, and have relatively fronted /ou/

Limitations & Future Steps

- Noisy data due to: recording environment, equipment, audio compression, etc.
- Small, diverse sample → difficult to generalize from
- Examine more speakers and features
- Gather perceptual judgment/ethnic identification data
 - Do any of the identified cluster patterns link to “sounding Asian”?

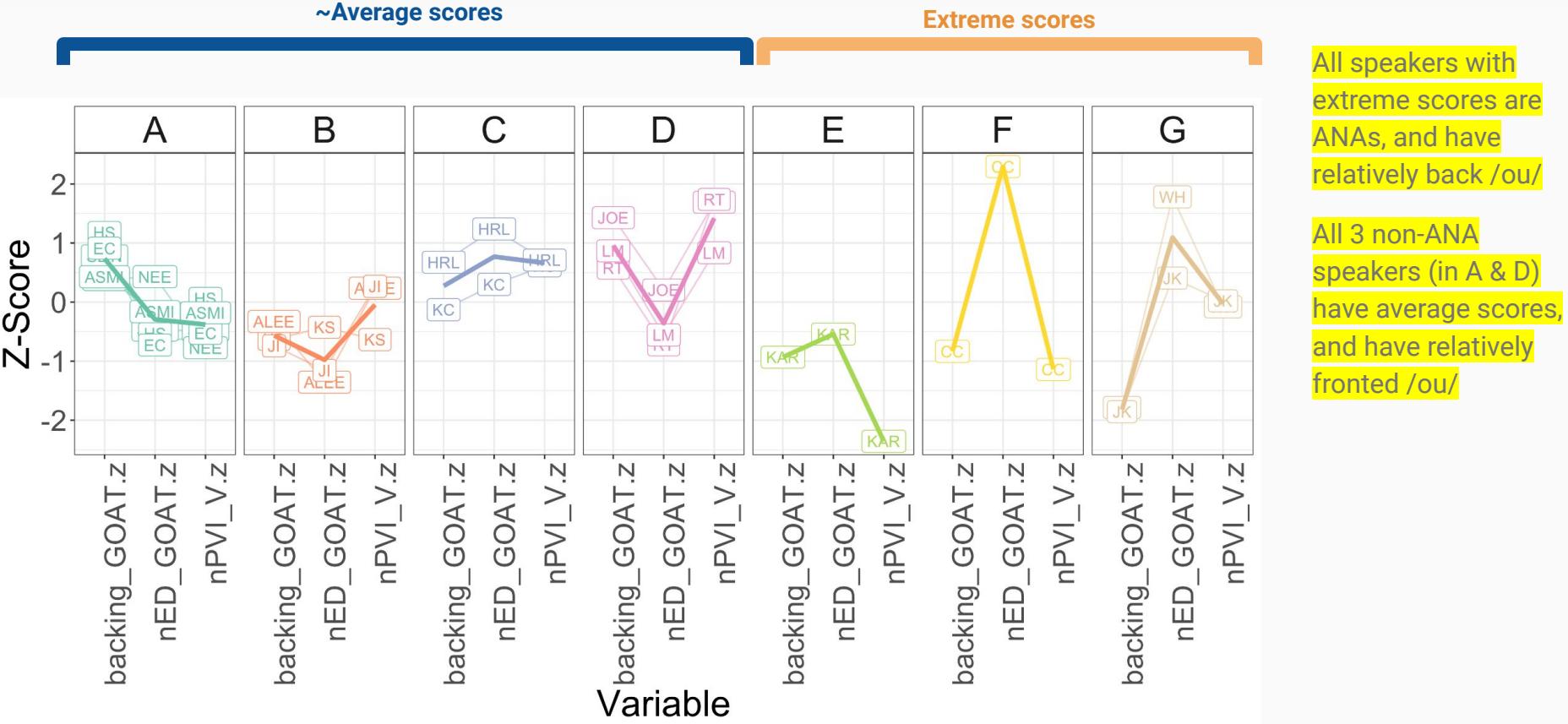
References

- Barreda, S. (2021). Fast Track: Fast (nearly) automatic formant-tracking using Praat. *Linguistics Vanguard*, 7(1).
- <https://doi.org/10.1515/lingvan-2020-0051>
- Barreda, S., & Nearey, T. M. (2018). A regression approach to vowel normalization for missing and unbalanced data. *The Journal of the Acoustical Society of America*, 144(1), 500–520.
- <https://doi.org/10.1121/1.5047742>
- Cheng, A. (2020). ‘School’ Versus ‘Home’: California-based Korean Americans’ Context-dependent Production of /u/ and /oU/. *University of Pennsylvania Working Papers in Linguistics*, 26(1).
- Cheng, A., & Cho, S. (2021). The Effect of Ethnicity on Identification of Korean American Speech. *Languages*, 6(4), 186.
- <https://doi.org/10.3390/languages6040186>
- Cheng, A., Faytak, M., & Cychosz, M. (2016). Language, race, and vowel space: Contemporary Californian English. In E. Clem, V. Dawson, A. Shen, & A. Horan (Eds.), *Proceedings of the Forty-Second Annual Meeting of the Berkeley Linguistics Society* (pp. 63–78).
- Cheng, L. S. P. & Kramer, M. A. (2021, October) Introducing LingTube: An open-source toolkit for linguistic analysis of YouTube data. Poster presented at New Ways of Analyzing Variation (NNAV) 49 (virtual).
- D’Onofrio, A., & van Hofwegen, J. (2020). Nisei Style: Vowel Dynamism in a Second-Generation Japanese American Community. *The Publication of the American Dialect Society*, 105(1), 79–94.
- <https://doi.org/10.1215/00031283-8820631>
- Hair, J. F., Black, W. C., Babin, B. J., & Anderson, R. E. (2019). *Multivariate data analysis* (Eighth edition). Cengage.
- Hall-Lew, L. (2009). Ethnicity and phonetic variation in a San Francisco neighborhood [Ph.D. Dissertation, Stanford University].
- Hanna, D. B. (1997). Do I Sound “Asian” to You?: Linguistic Markers of Asian American Identity. *UPenn Working Papers in Linguistics*, 4(2), 15.
- Newman, M., & Wu, A. (2011). “Do You Sound Asian When You Speak English?” Racial Identification and Voice in Chinese and Korean Americans’ English. *American Speech*, 86(2), 152–178.
- McAuliffe, M., Socolof, M., Mihuc, S., Wagner, M., & Sonderegger, M. (2017). Montreal Forced Aligner: Trainable Text-Speech Alignment Using Kaldi. *INTERSPEECH*. <https://doi.org/10.21437/interspeech.2017-1386>
- Wong, P., & Babel, M. (2017). Perceptual identification of talker ethnicity in Vancouver English. *Journal of Sociolinguistics*, 21(5), 603–628.
- Zipp, L., & Staicov, A. (2016). English in San Francisco Chinatown: Indexing identity with speech rhythm? *World Englishes*, 205–228.

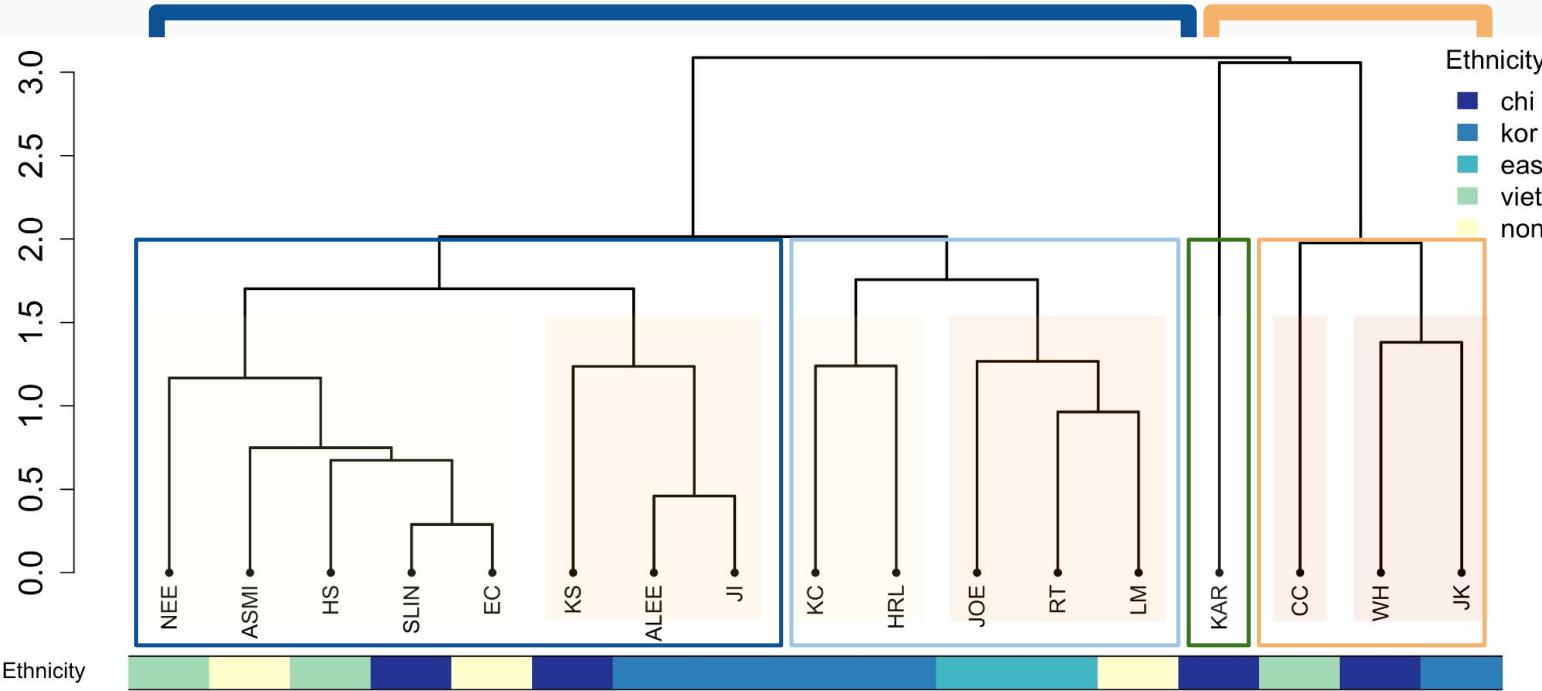
Results: Hierarchical Clustering Analysis (n=17)

- Method: Hierarchical agglomerative clustering via the average-linkage method on Euclidean distances (Hair et al. 2019)
 - Each speaker starts as a cluster; grouped with most similar by avg. distances
 - Benefits:
 - Allows for “**classes**” of different sizes and shapes
 - Mitigates the effects of outliers (unlike Ward’s)
- Results:
 - Optimal solution is **2, 5, 7 clusters**
 - Groups do not align with ethnicity
 - More detailed pattern corresponds to impressionistic judgments
 - Distinction between certain ANAs and rest of speakers
 - Consistent with expectations based on ethnicity

Results: Hierarchical Clustering Analysis (n=17)



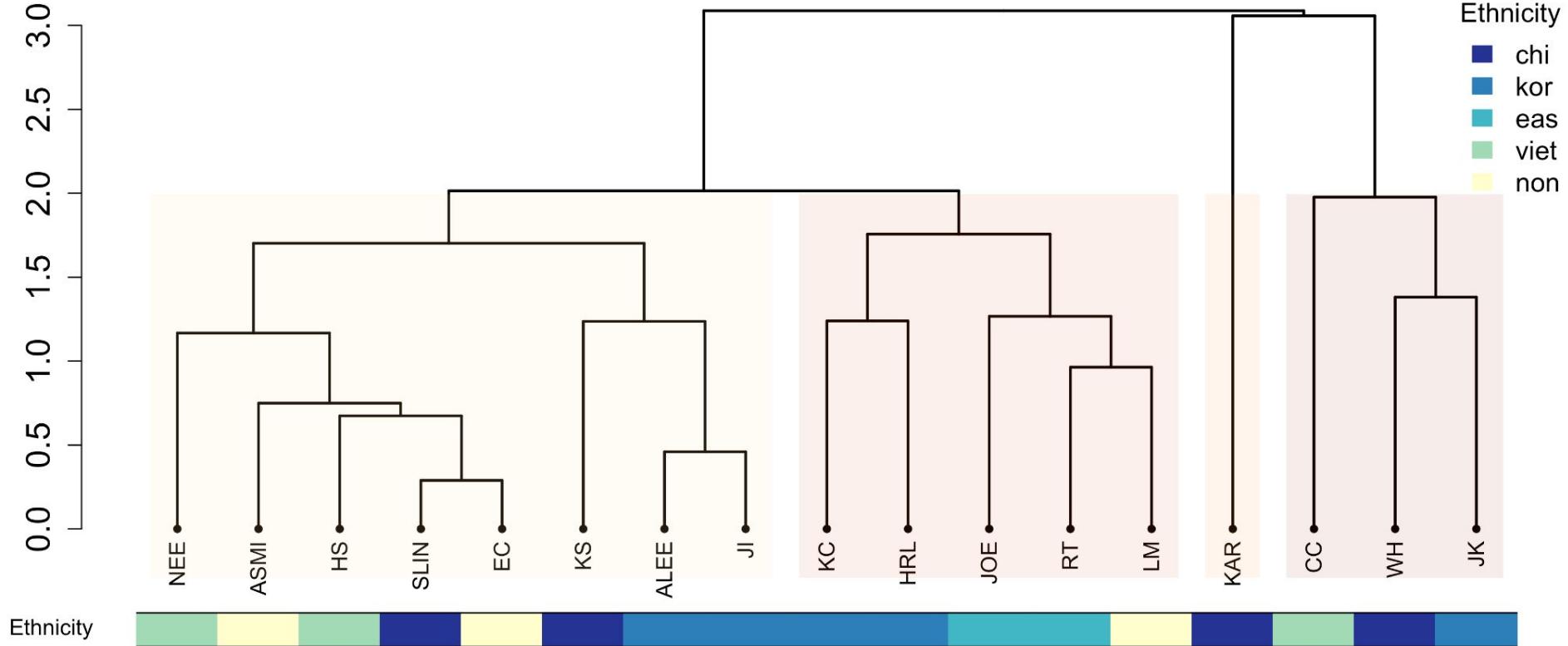
Results: Hierarchical Clustering Analysis (n=17)



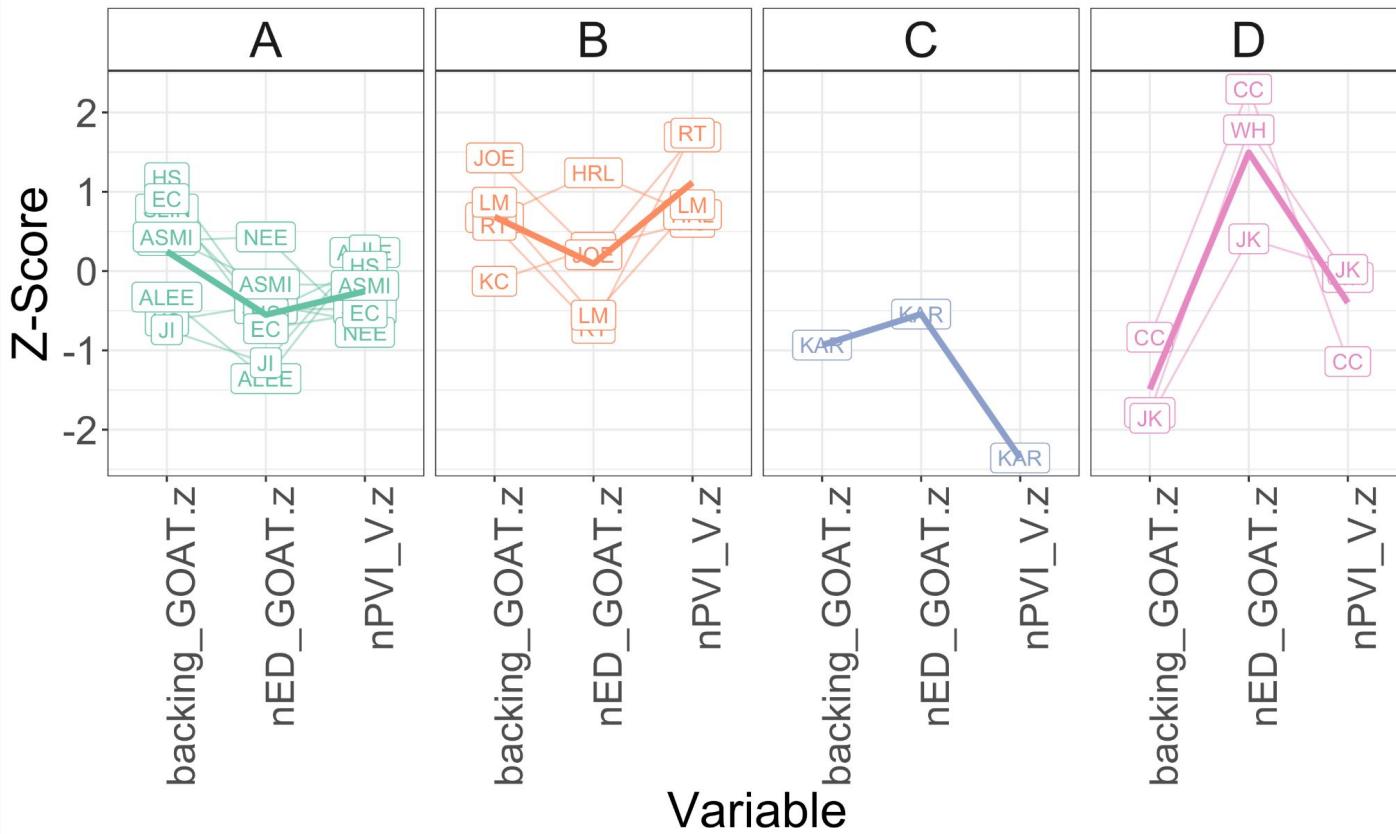
Overall, clusters are not well-aligned with ethnicity (i.e., ethnicity is not a main factor in phonetic patterns)

But, some potential patterns could arise given a larger dataset (many pairs per ethnic group close together; from left: Viet, Non, CHi, Kor)

Results: Hierarchical Clustering Analysis (n=17)

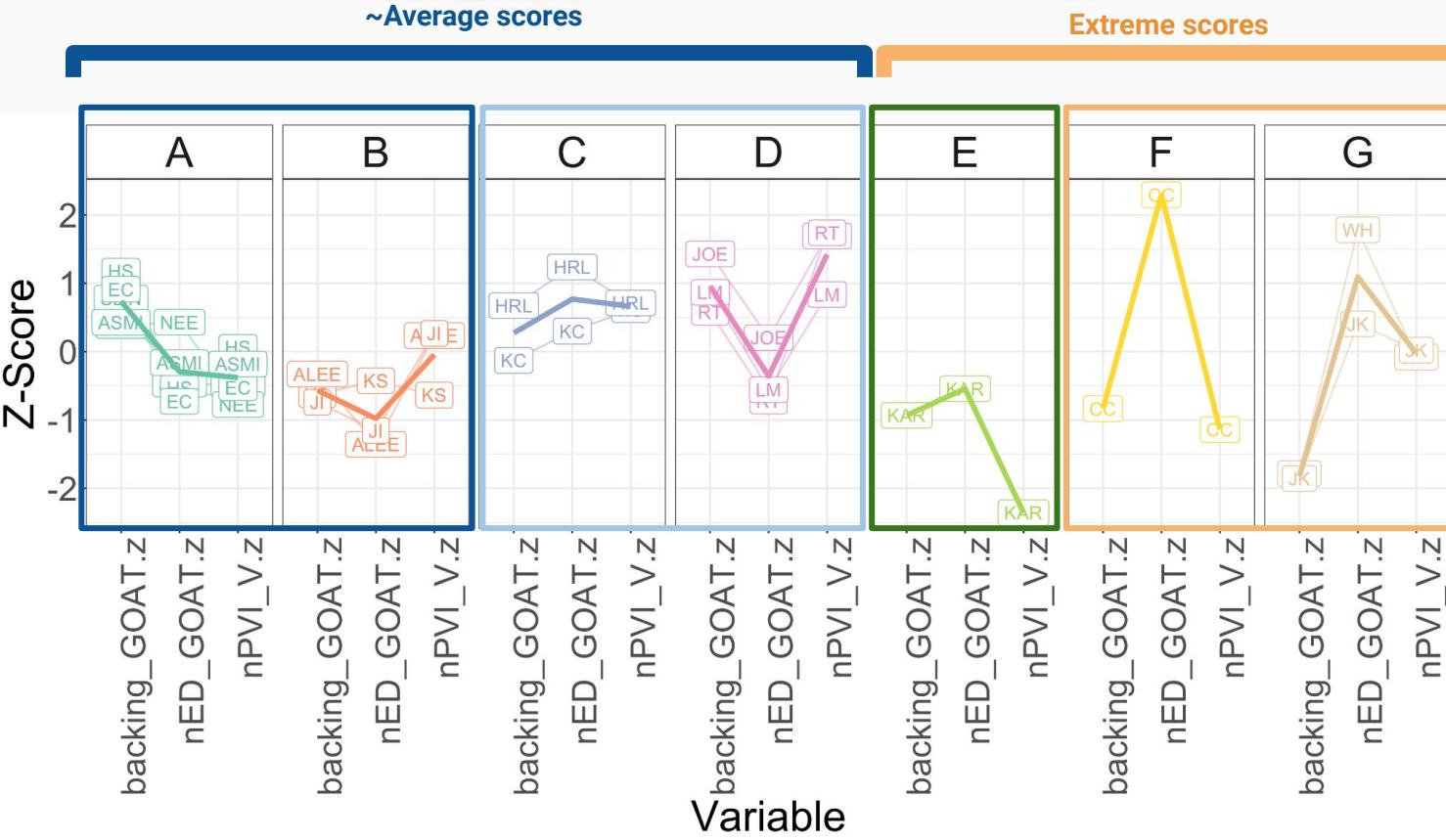


Results: Hierarchical Clustering Analysis (n=17)

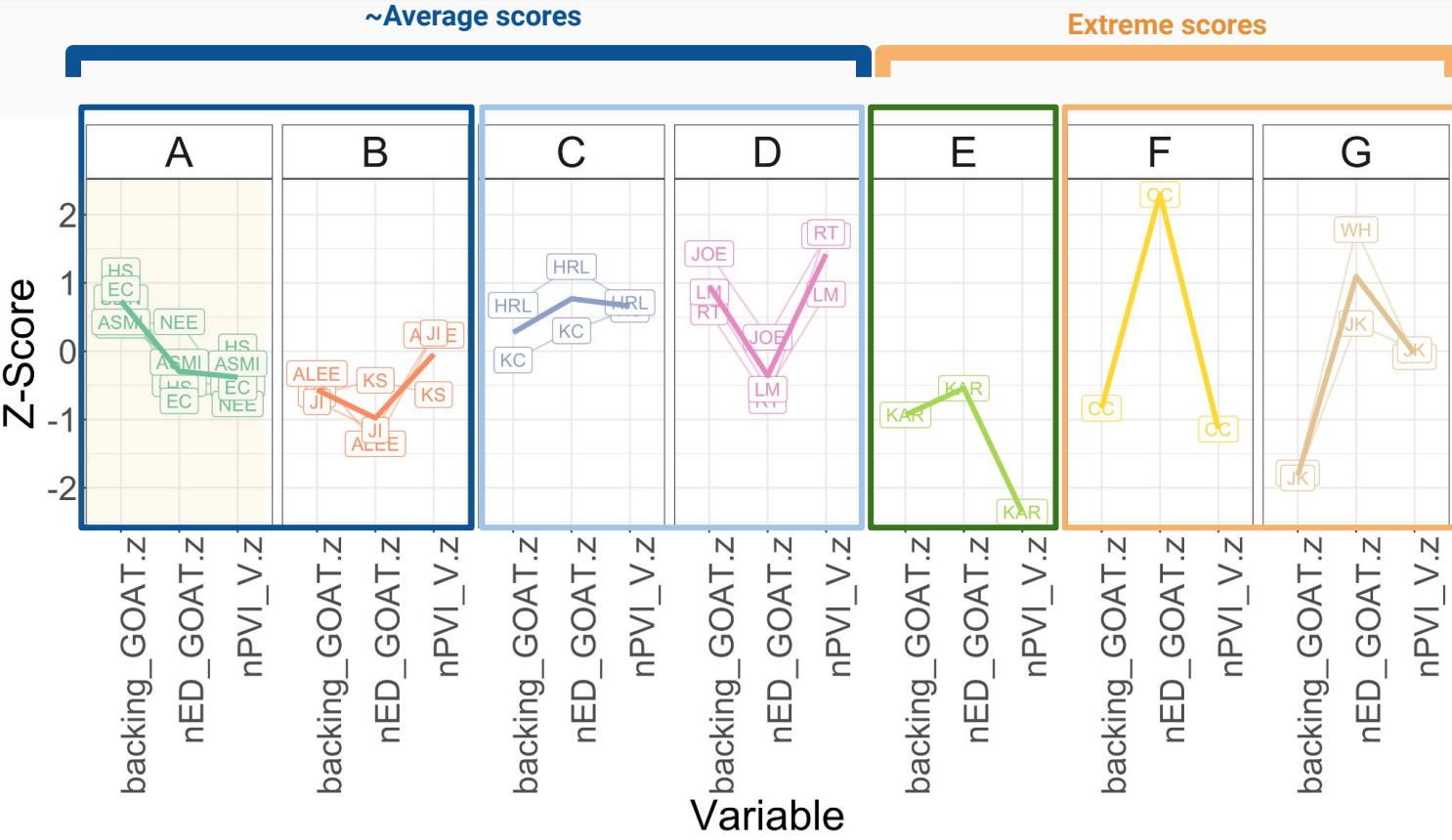


- A = average scores
- B = generally above average, more durational variability
- C = very low scores (more ANA-associated), especially low durational variability
- D = very back /ou/, very diphthongal /ou/, relatively low durational variability

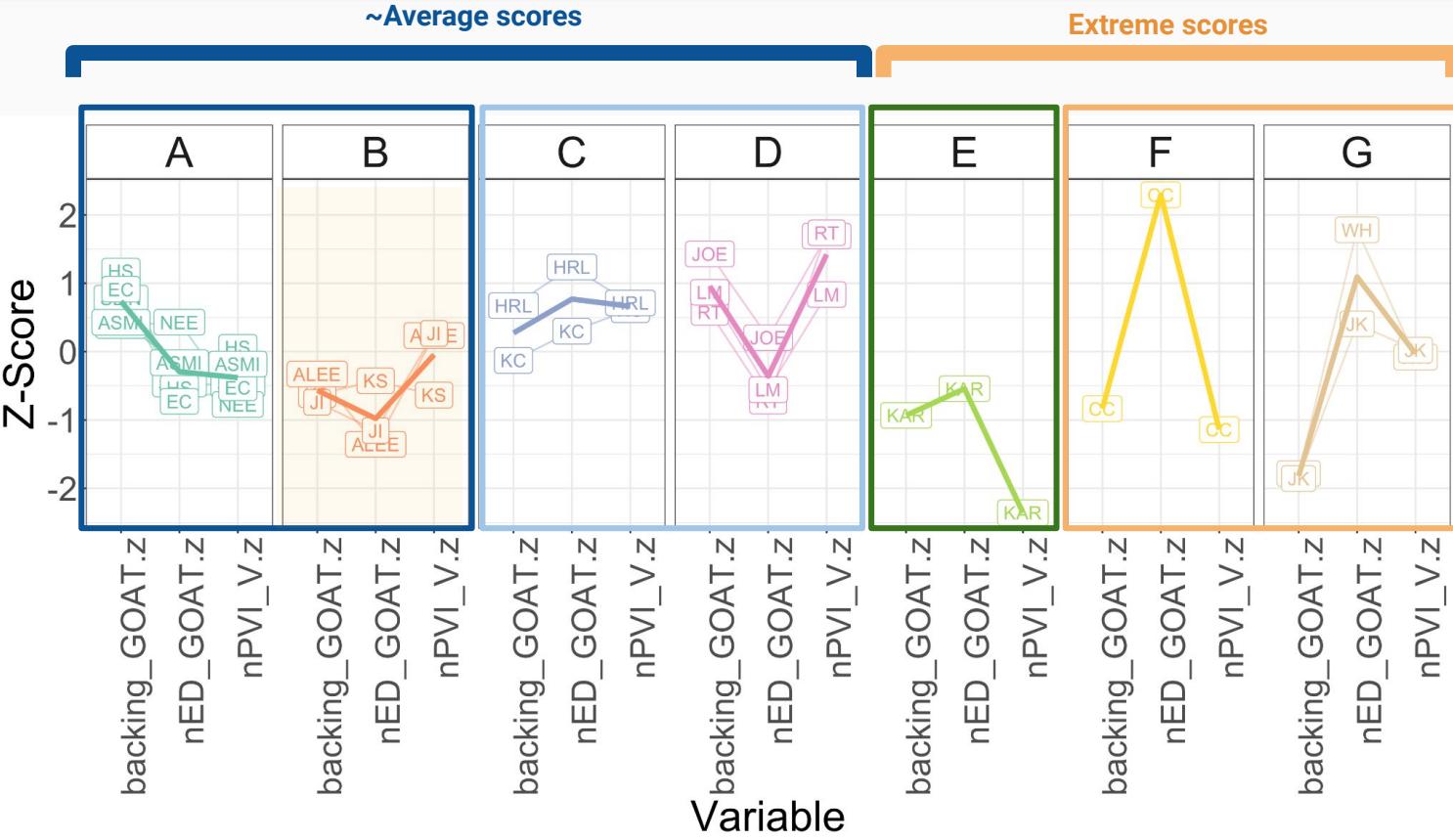
Results: Hierarchical Clustering Analysis (n=17)



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Results: Hierarchical Clustering Analysis (n=17)

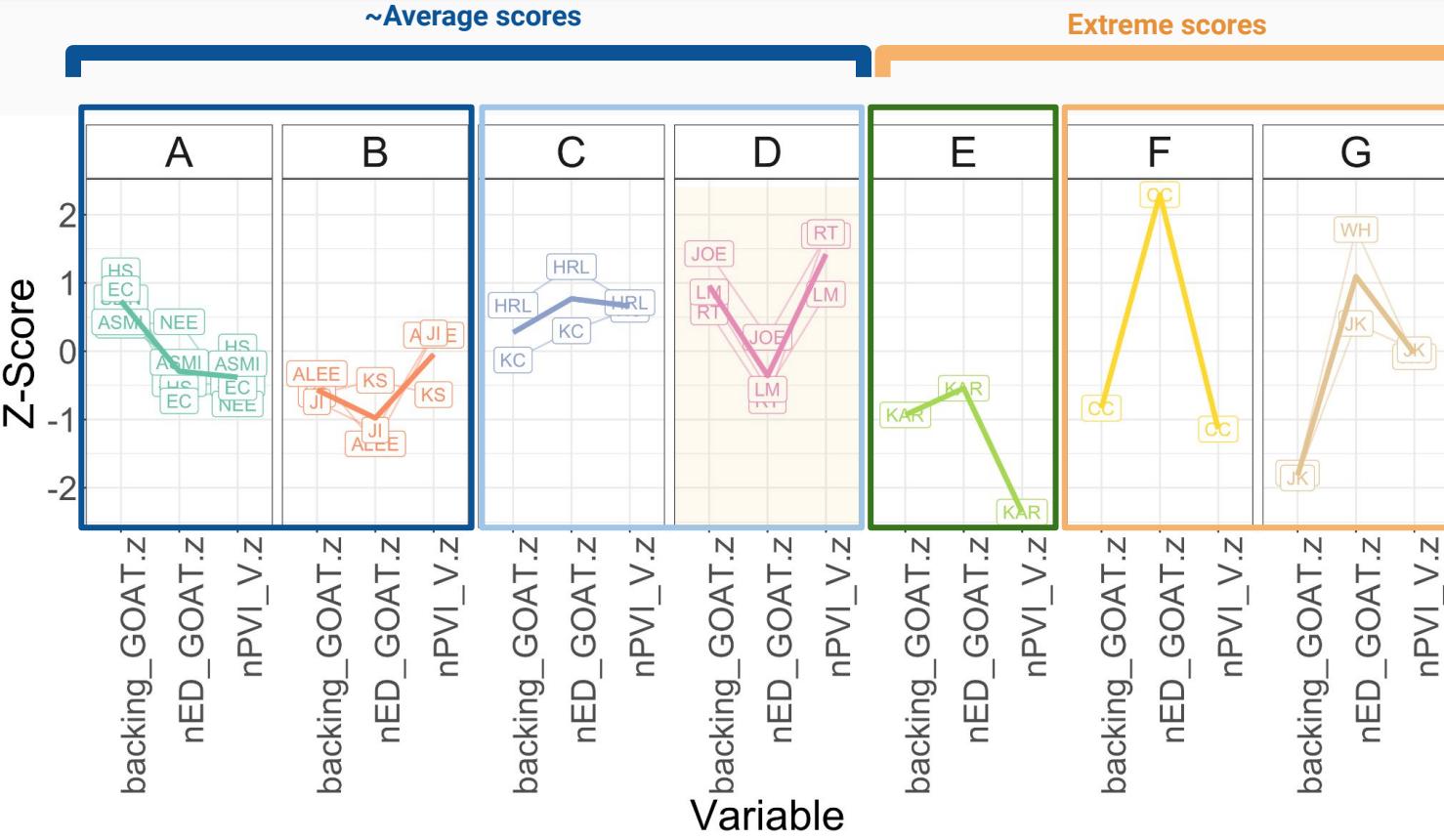


Cluster B

Description:
Relatively backed and monophthongal /ou/ + average durational variability.

Interpretation:
Korean American predicted pattern (includes 2 out of 5 KorAms)

Results: Hierarchical Clustering Analysis (n=17)

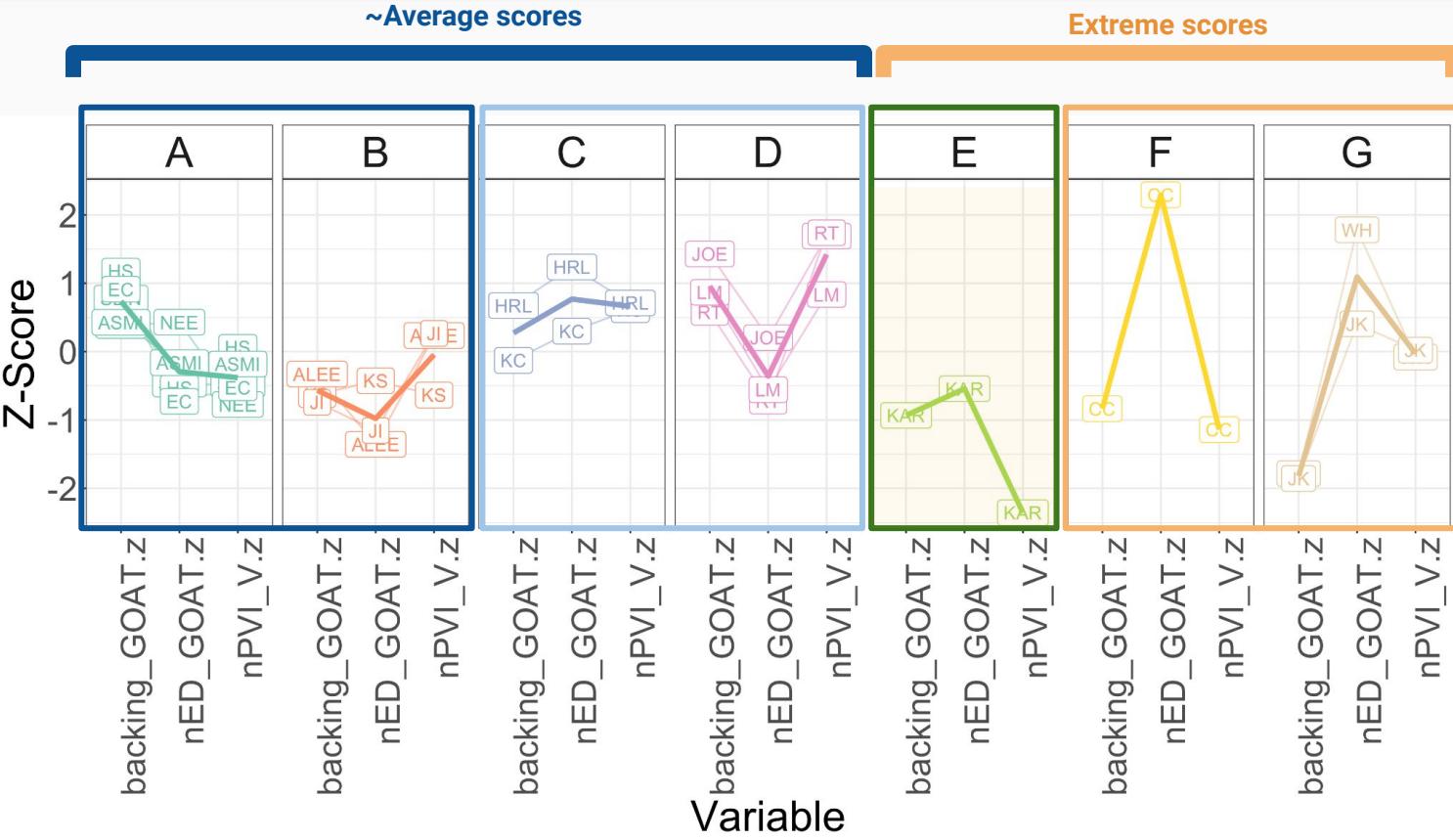


Cluster D

Description:
Relatively fronted /ou/ + high durational variability.

Interpretation:
Mainstream
Californian but with particularly variable speech style (possibly 'YouTube speech')

Results: Hierarchical Clustering Analysis (n=17)

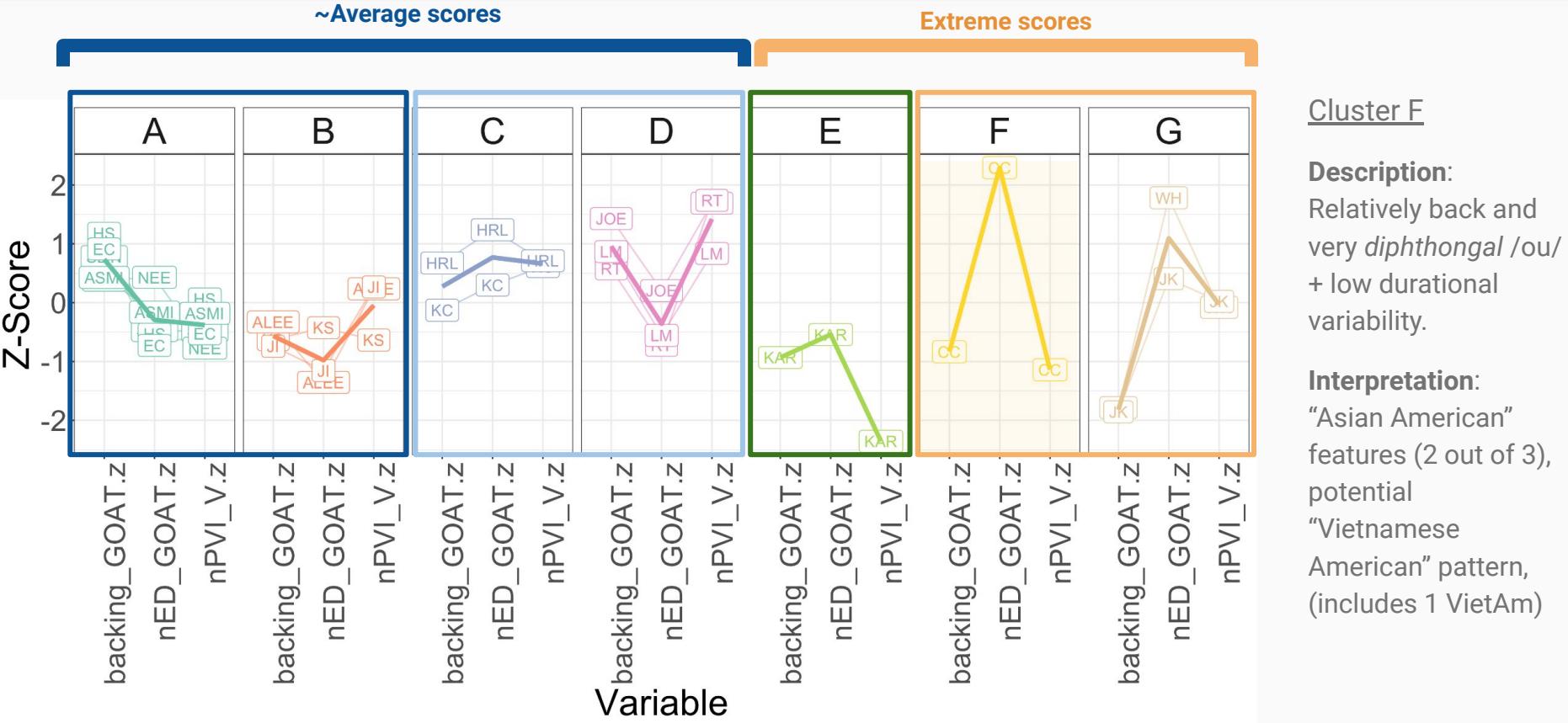


Cluster E

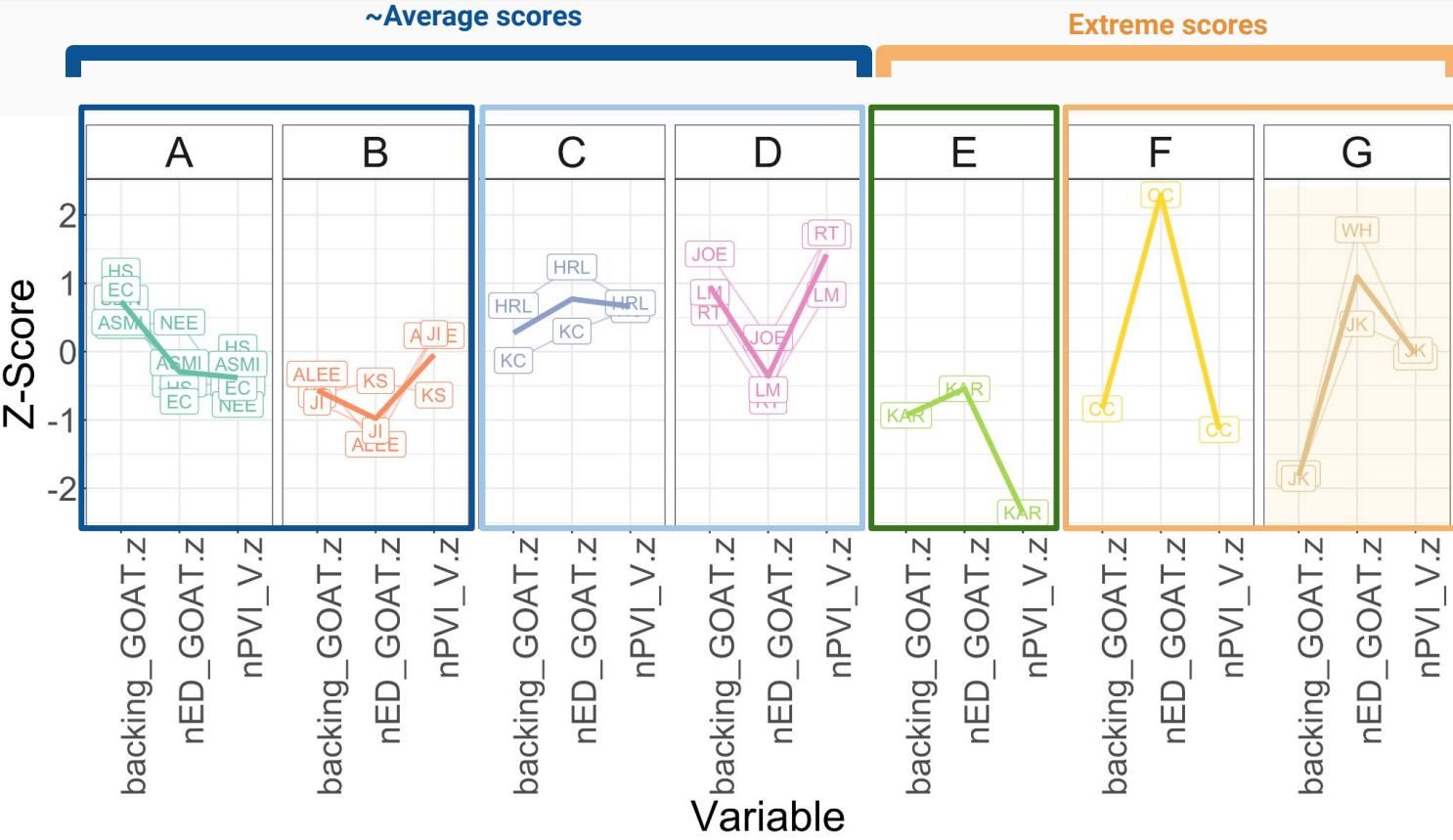
Description:
Relatively back and monophthongal /ou/ + very low durational variability.

Interpretation:
“Asian American” predicted pattern, particularly on the Chinese American associated feature (includes 1 ChiAm)

Results: Hierarchical Clustering Analysis (n=17)



Results: Hierarchical Clustering Analysis (n=17)



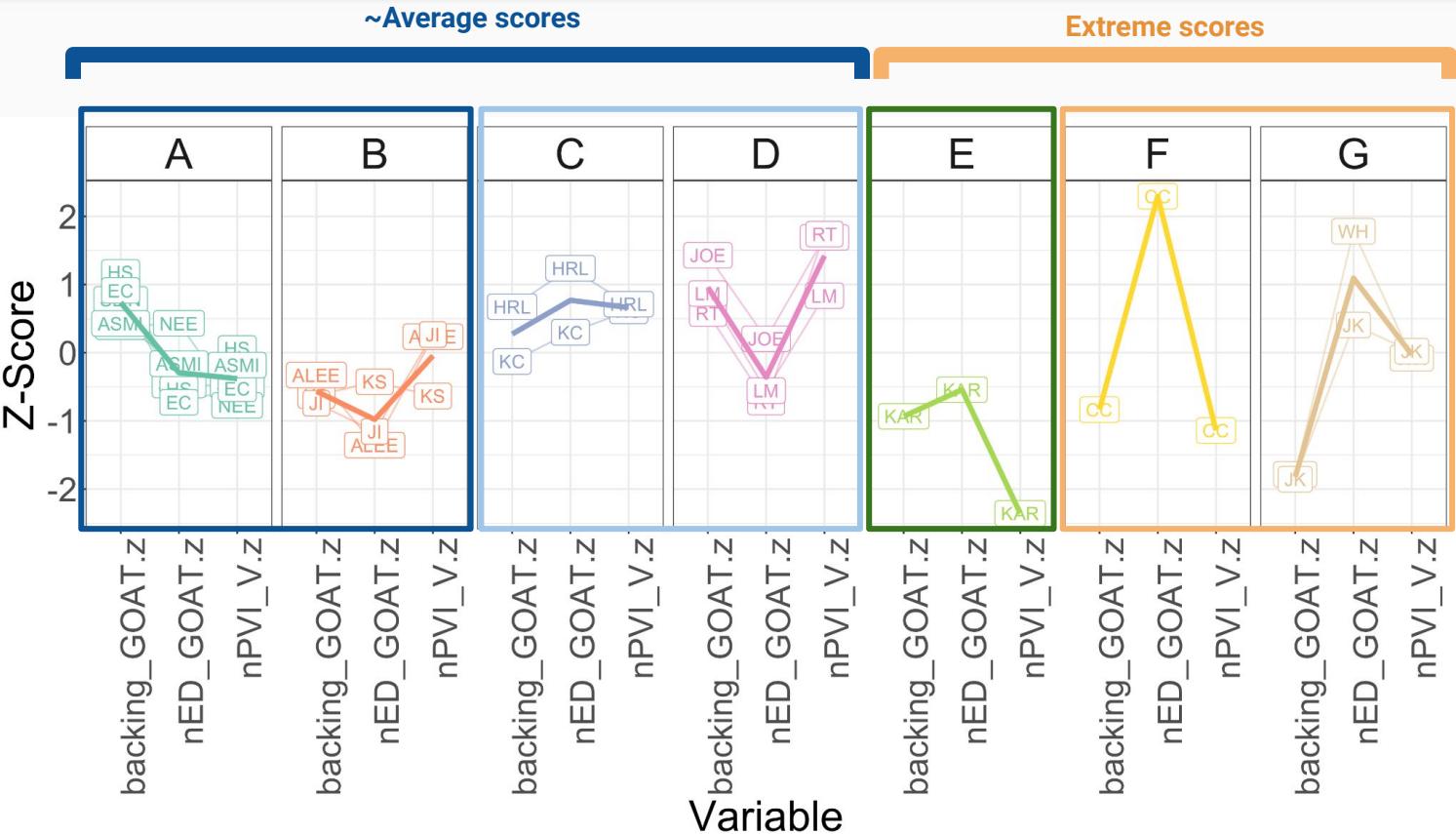
Cluster G

Description: Very back and relatively diphthongal /ou/ + average durational variability..

Interpretation:

Strong showing of one “Asian American” feature, possibly indicative of a different ANA pattern (includes 1 ChiAm, 1 KorAm)

Results: Hierarchical Clustering Analysis (n=17)



(1) Slightly below average

- A = Relative /ou/-fronters
 - Else ~average == roughly main Chi-Am pattern
 - 2 non ANAs, 2 viet, 1 canto-Am
- B = Relative /ou/-backers and monophthongal
 - ~2 out of 3 ANA features, + average
 - Kor-Am pattern
 - 2 KorAm (the one Chi-Am does not have)

(2) Slightly above average

- C= all just kind of above average
 - hard to assess; mainstream-y
- D = /ou/-fronters with highly variable duration
 - Advanced fronters like A, but here with high variability – just mainstream rhythmic speech style?

(3) Very low + extreme differences

- E = monophthongal, retracted /ou/, with very low rhythm
 - (i.e., all of the ANA features, except Chi-specific rhythm)
 - A Canto-Am

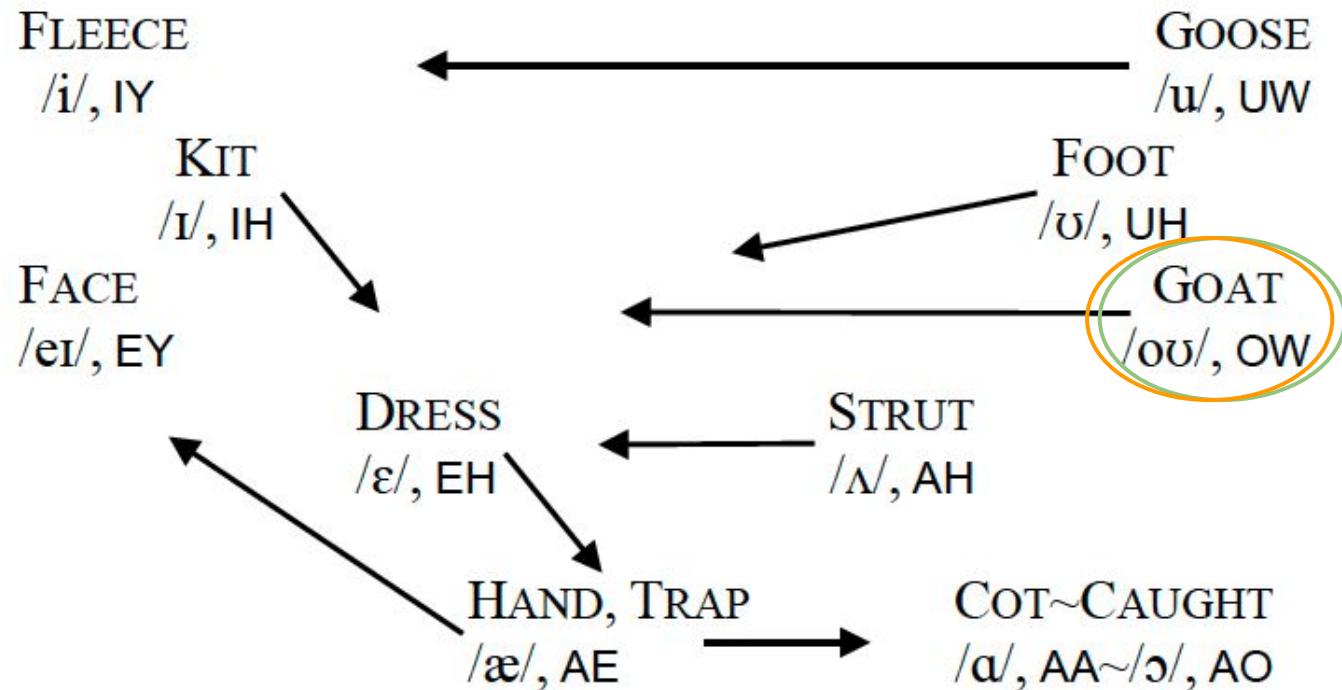
(4) Very extreme differences

- F = Backed /ou/ with low rhythm variability +
 - Very strongly ANA pattern except have strong/any predictions specifically for Viet-Am, of which substrates are diphthongs
- D = very back /ou/ with relatively diphthongal (is actually fully average)
 - Very strong ANA feature of /ou/ coinciding with more contact and vowel features
 - Actually looks like 2 different patterns
 - WH with very distinct contact
 - JK with only very slight otherwise average contact like C (other kind extremely low /)

Prelim-Prelim Analysis

ANA Features: California Vowel Shift (CVS)

(1) *California Vowel Shift, adapted from Hall-Lew (2009)*



(diagram from Cheng, Faytak & Cybosz, 2016)

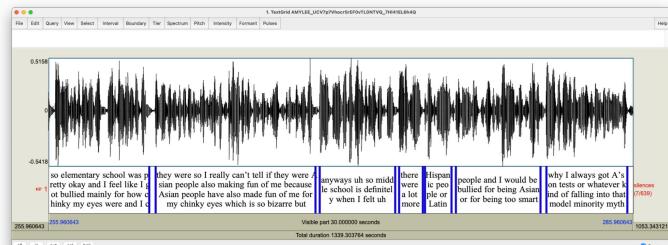
Methods: Speakers

- 35 speakers (25 ANA, 10 non-ANA)
 - Spent childhood in California
 - Present as women
 - East Asian and southeast Asian only
 - Majority were born in U.S. to immigrant parents (i.e., 2nd gen)
- Current sample of data so far: 10 ANAs

| Ethnic Identification | Corpus n | Sample n |
|-----------------------|-----------|-----------|
| Korean | 7 | 5 |
| Chinese | 5 | 2 |
| Vietnamese | 3 | 1 |
| Taiwanese | 3 | 1 |
| Malaysian | 1 | |
| Japanese | 1 | |
| Indonesian | 1 | |
| Filipino | 2 | |
| Chinese-Korean | 1 | 1 |
| Cambodian | 1 | |
| Grand Total | 25 | 10 |

Methods: Video Data Processing

1. Identified speakers on YouTube (mainly via "Growing Up Asian American tag")
 - a. Collected self-described ethnicity and regional origin information as available (mainly via user-posted Q&A or tag videos)
 - b. Manually screened videos (1-3 per speaker) for audio quality and length
2. Downloaded and pre-processed video captions and audio via Python
3. Semi-manually corrected and time-aligned captions to audio



Methods: Vowel Data Processing

1. Automatic forced alignment using the Montreal Forced Aligner (McAuliffe et al. 2017)
2. Hand-correction of vowels and coding of issues (boundaries, creak, noise/other problems)
3. Extract vowel durations and log-mean normalized F1, F2 and F3 values (Barreda & Neary, 2018) via FastTrack (Barreda, 2021)
 - a. Formant values are median values from 9 bins of time (timepoint 5 is the median value between roughly 44-55% into the vowel)
4. Remove outliers/noise
 - a. Glottalized/creaky, breathy/voiceless, background noise/sound effects
 - b. Shorter than 40ms (mono) or 75 ms (diph)
 - c. Calculated Mahalanobis distance ... Greater and less than 3 SD from the mean
5. Removed non-target data
 - a. Stopwords (e.g. function words)
 - b. Vowels with non-primary stress
 - c. Vowels preceding liquid (/l/, /r/) and nasal (/n/, /m/, /ŋ/) sonorants

ANA Features: Predictions

| Feature | Vowel | Prediction |
|---------------------|----------------------------|------------|
| Backing | /oʊ/ (GOAT) | |
| | /u/ (GOOSE) | |
| Monoph-thongization | /oʊ/ (GOAT) /eɪ/ (FACE) | |
| Prosodic rhythm | | |

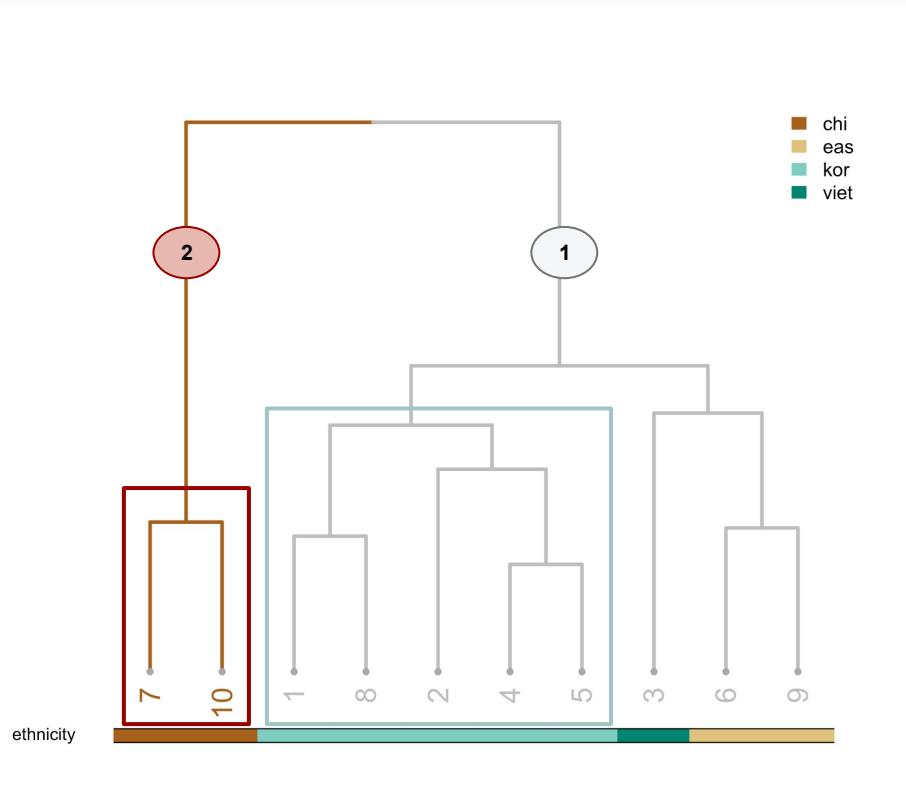
Methods: Variables & Measures

| Feature | Vowel | Measure |
|--------------------|--|---------|
| Backing | a. GOAT /ou/ | |
| Monophthongization | a. GOAT /ou/ | |
| Prosodic Rhythm | All vowels (durational variability) | |

Methods: Variables & Measures

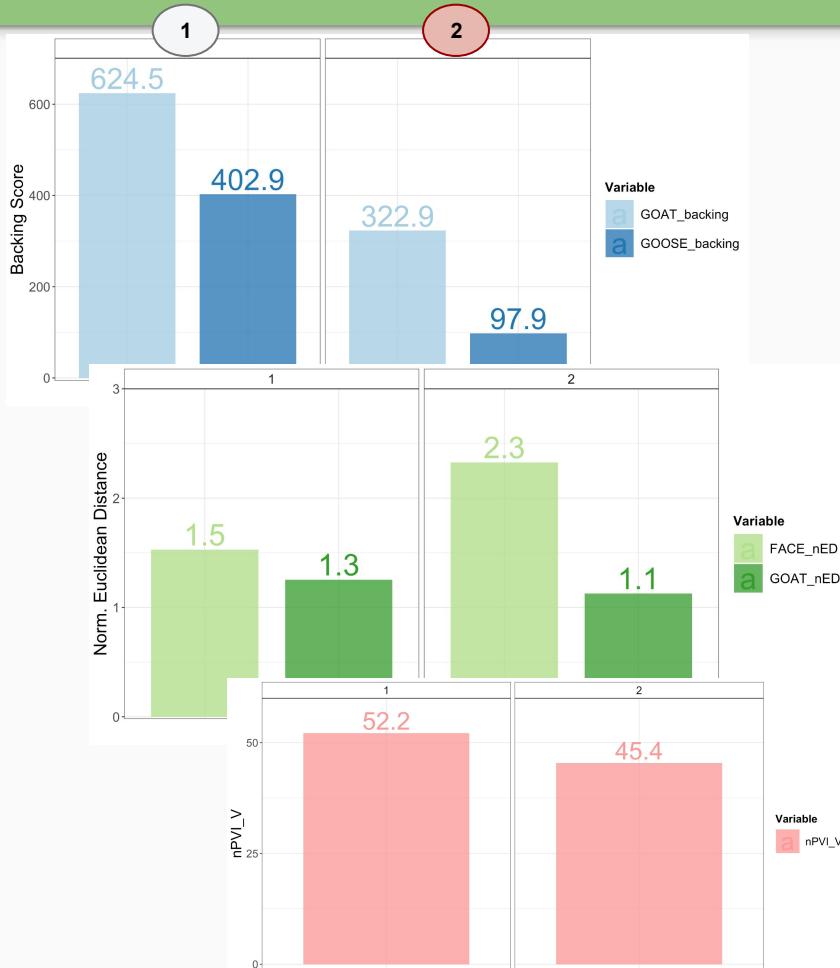
| Feature | Vowel | Measure |
|--------------------|--|--|
| Backing | a. GOAT /ou/ b. GOOSE /u/ | Relative backing score: difference in token F2 from mean FLEECE F2 (<i>higher = more back</i>) |
| Monophthongization | a. GOAT /ou/ b. FACE /ei/ | Norm. Euclidean distance (nED): ED of F1+F2 values at 25% and 75%, divided by token duration (<i>lower = more mono</i>) |
| Prosodic Rhythm | All vowels (durational variability) | Norm. pairwise variability index (nPVI): Average (median) duration difference b/t each pair of vowels, divided by mean pair duration (<i>lower = more “syllable-timed”</i>) |

Clustering Results: Hand-corrected measures (n=10)



- Ran hierarchical agglomerative clustering on Euclidean distances via Ward's (minimum variance) method
 - i.e., each speaker starts as own cluster → grouped with most similar, and so on
- Optimal solution is **2 clusters**
- These emergent groups appear to line up with ethnicity in this sample
 - Cluster 2 = the two **Chinese Americans**
 - Cluster 1 = everyone else, where **Korean Americans** cluster together

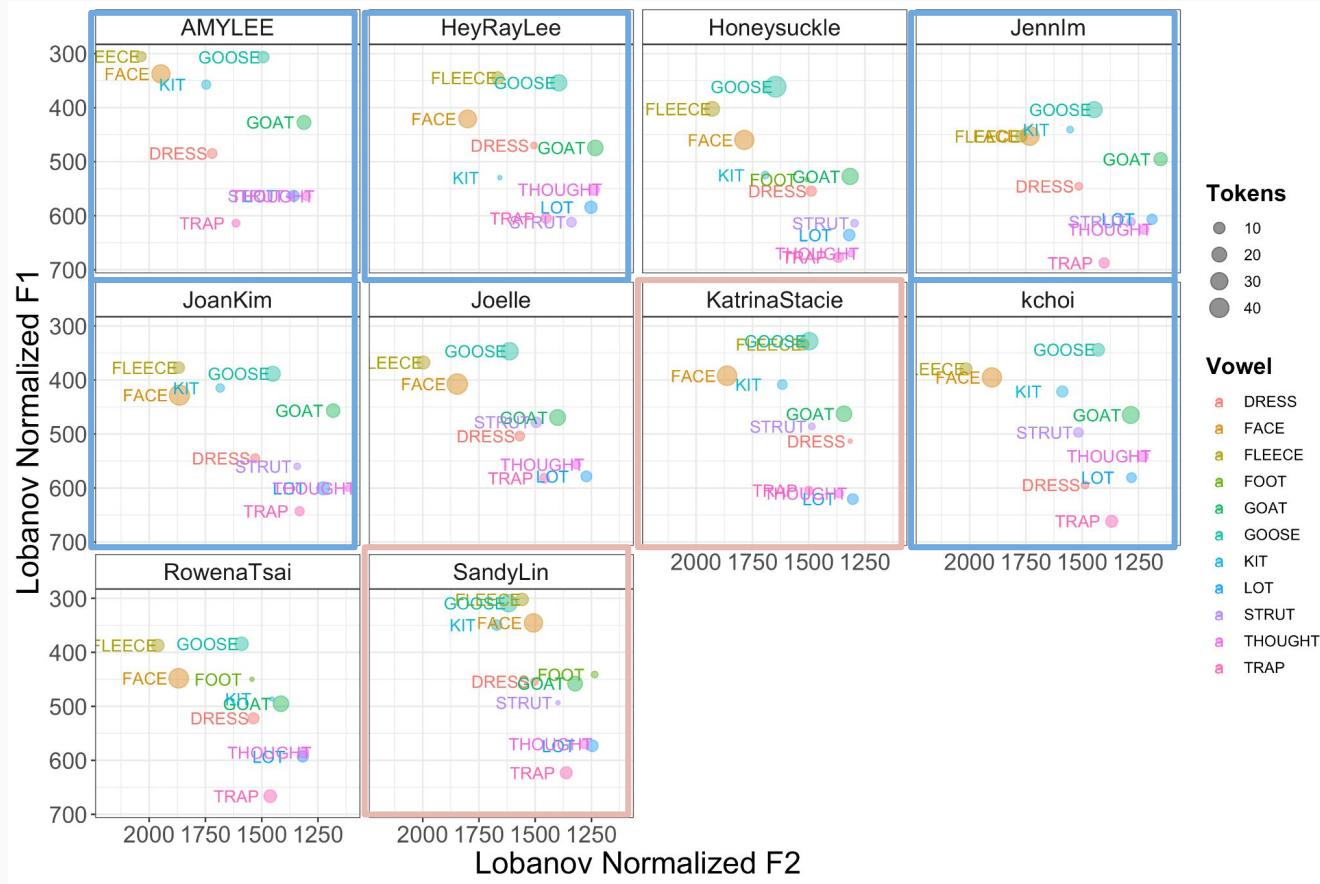
Clustering Results: Hand-corrected measures (n=10)



| Feature | 1 (mostly Kor-Am) | 2 (Chi-Am) |
|---------------|----------------------|------------------|
| GOAT-backing | Very retracted | More fronted (?) |
| GOOSE-backing | More retracted * | Very fronted (?) |

~30-43 for Hispanic speakers (Thomas & Carter, 2006)
 ~33-53 for ANAs (with an average of 43 in Bauman, 2016) or
 ~35-45 (for the Chinese men in Newman & Wu, 2011)
 ~50-55 for White and Black speakers (Thomas & Carter, 2006)

Individual Data: Hand-corrected measures (n=10)



Mean F1/F2 per vowel
nucleus midpoint

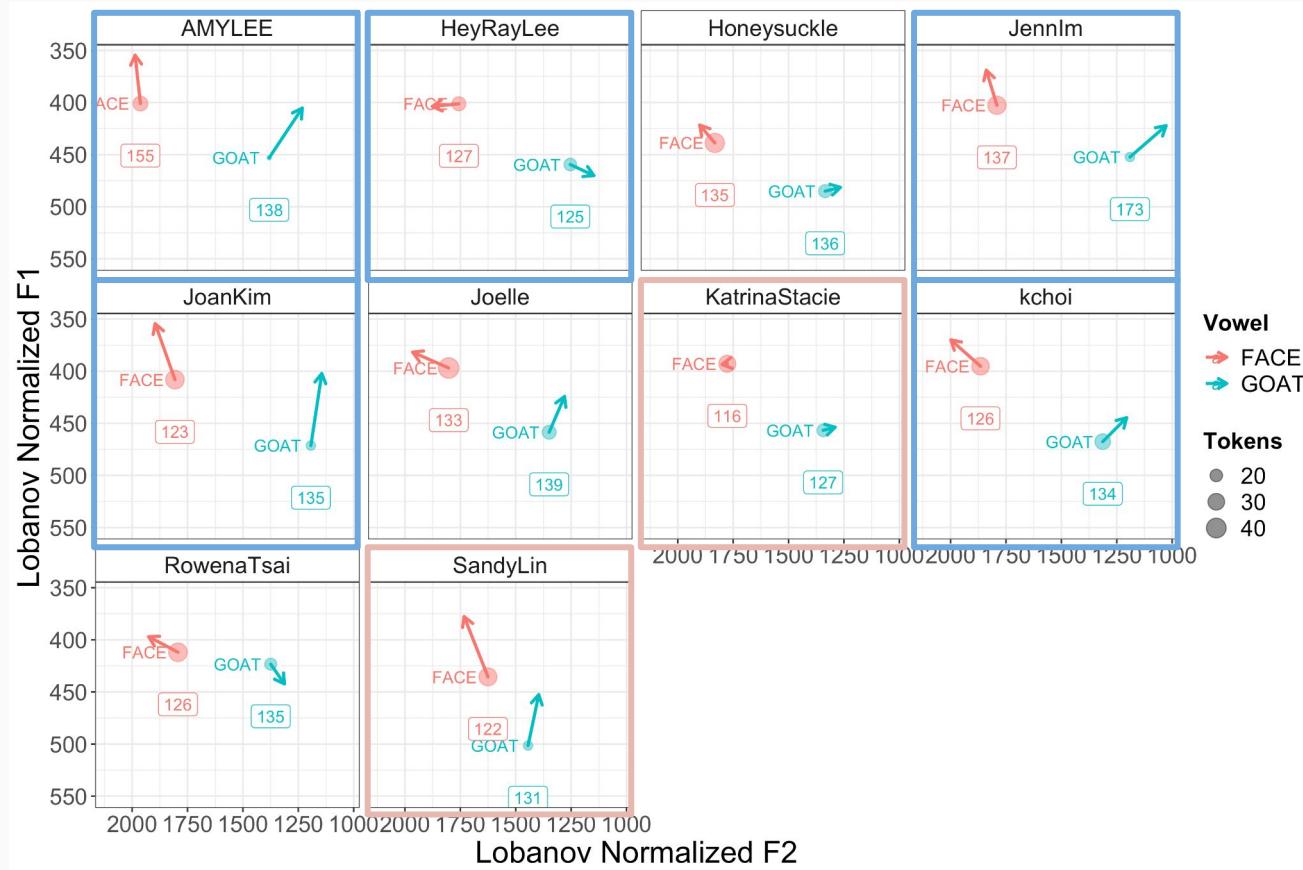
Tokens

- 10
- 20
- 30
- 40

Vowel

- DRESS
- FACE
- FLEECE
- FOOT
- GOAT
- GOOSE
- KIT
- LOT
- STRUT
- THOUGHT
- TRAP

Individual Data: Hand-corrected measures (n=10)

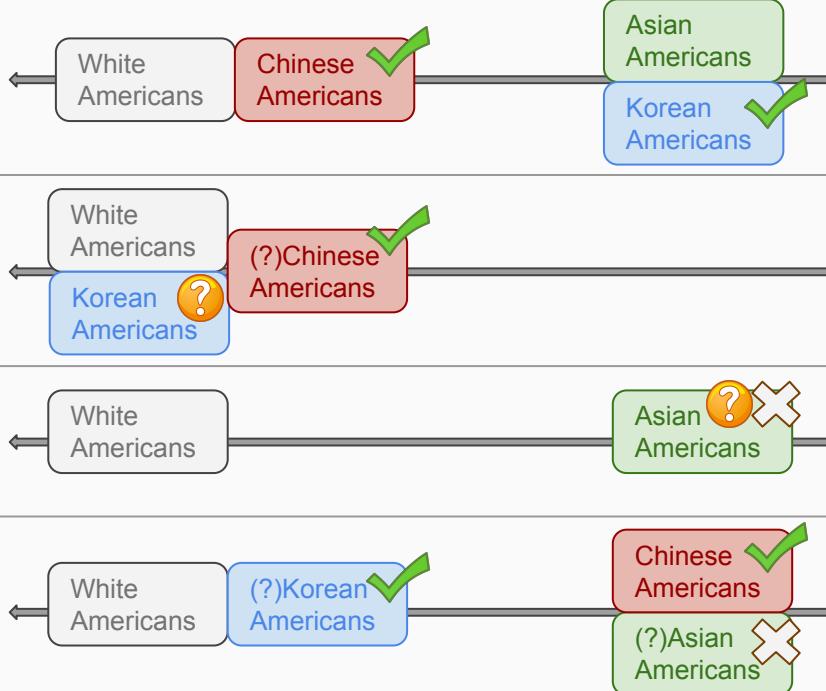


Mean F1/F2 per diphthong onset (25%) and offset (75%)

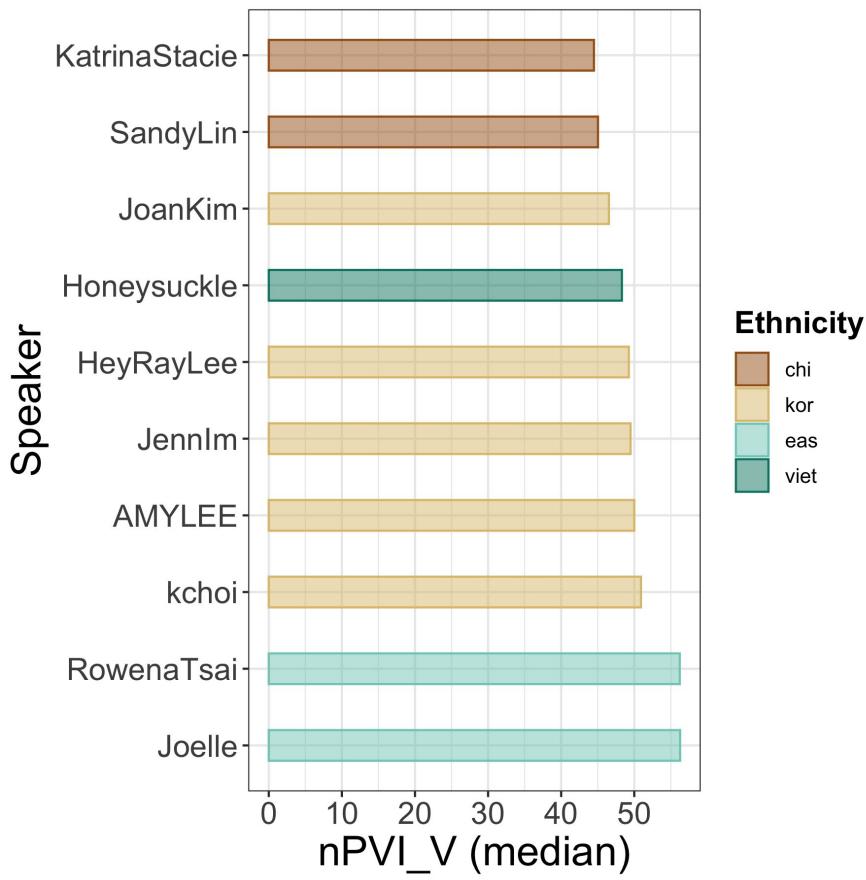
- Mean durations labelled but not controlled for

ANA Features: Predictions

| Feature | Vowel | Prediction | | |
|--------------------|---------------------------|--|---|--|
| Backing | /oʊ/ (GOAT) | Fronted (higher F2) | White Americans | Asian Americans Korean Americans |
| | /u/ (GOOSE) | Fronted (higher F2) | White Americans Korean Americans | (?)Chinese Americans |
| Monophthongization | oʊ/ (GOAT) /eɪ/ (FACE) | Diphthongal (more formant movement) | White Americans | Asian Americans |
| Prosodic rhythm | | “Stress-timed” (more variable vowel duration) | White Americans (?)Korean Americans | Chinese Americans (?)Asian Americans |



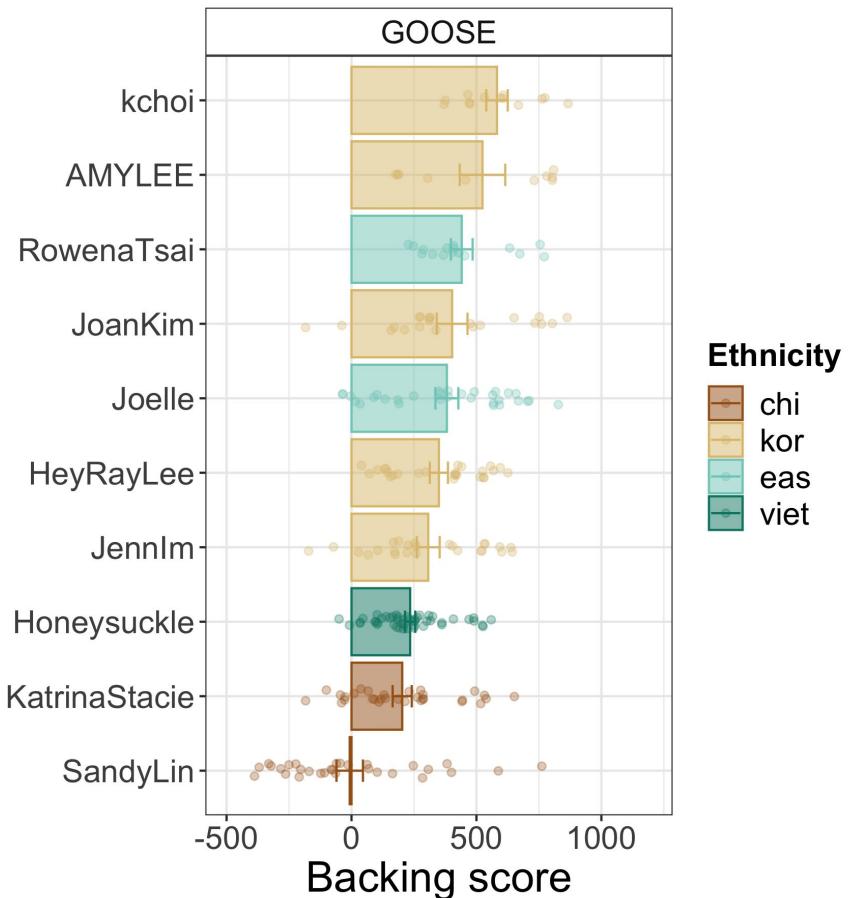
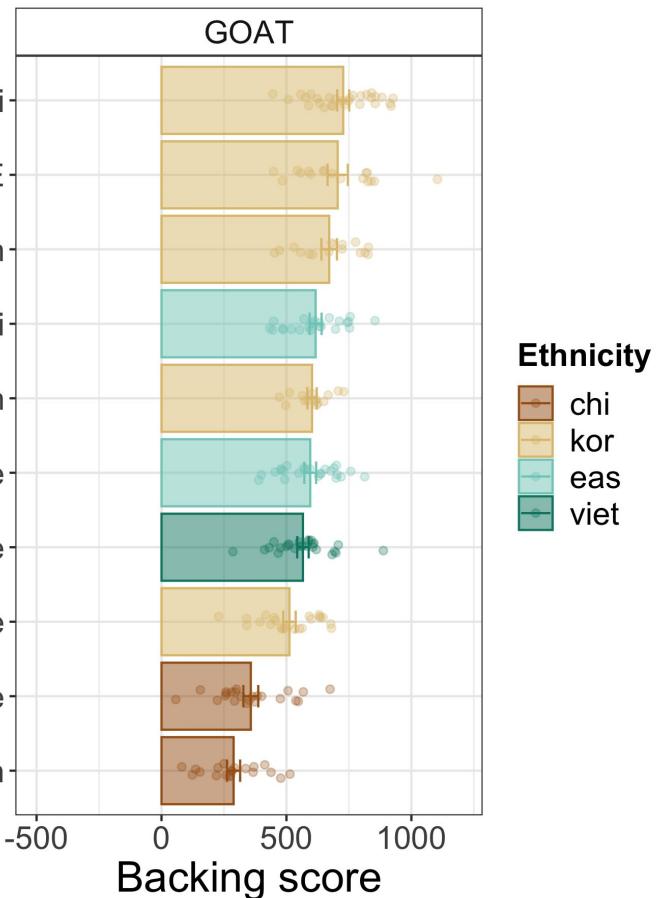
Individual Data: Prosodic Rhythm



- Numerical patterning by ethnicity
 - Generally lines up with the clustering results that consider all measures together

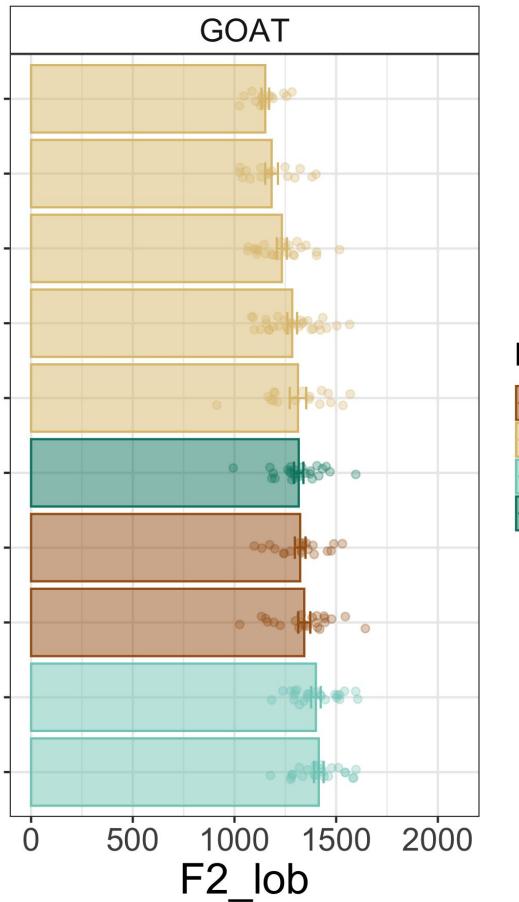
Individual Data: Back vowel fronting (score)

Speaker



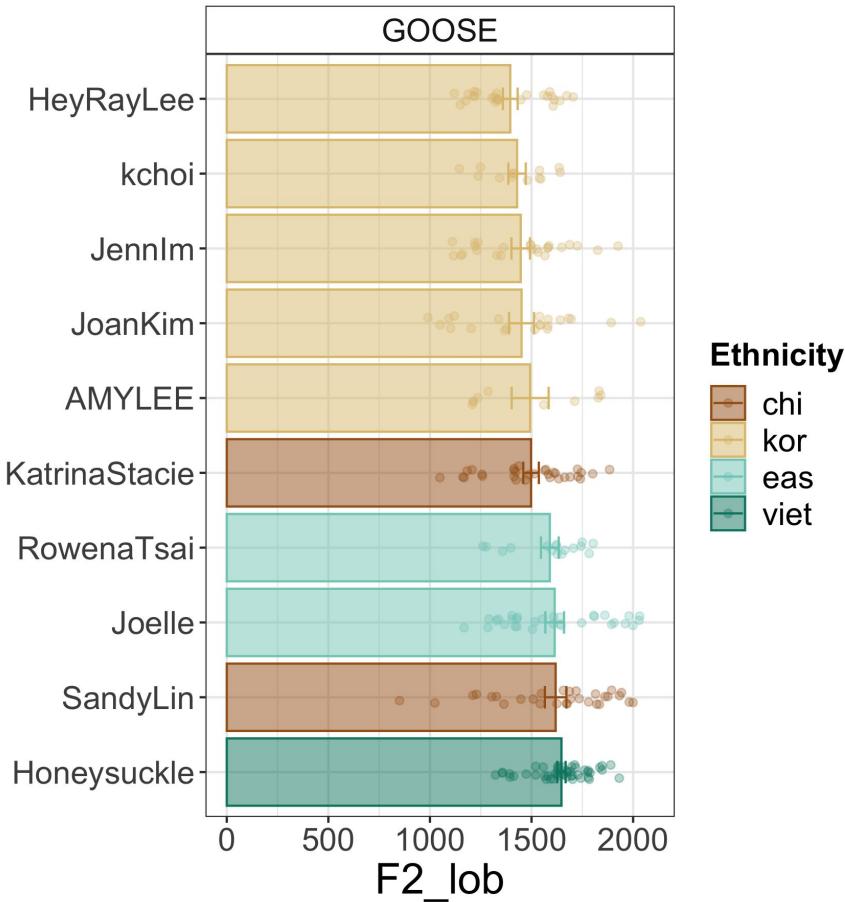
Individual Data: Back vowel fronting (F2)

Speaker



Ethnicity

- chi
- kor
- eas
- viet

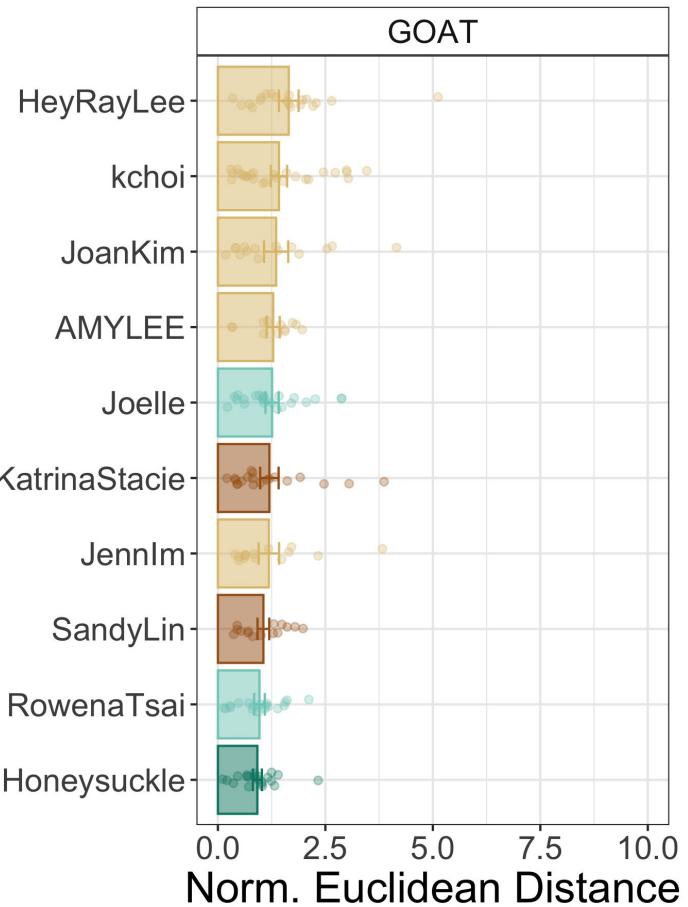


Ethnicity

- chi
- kor
- eas
- viet

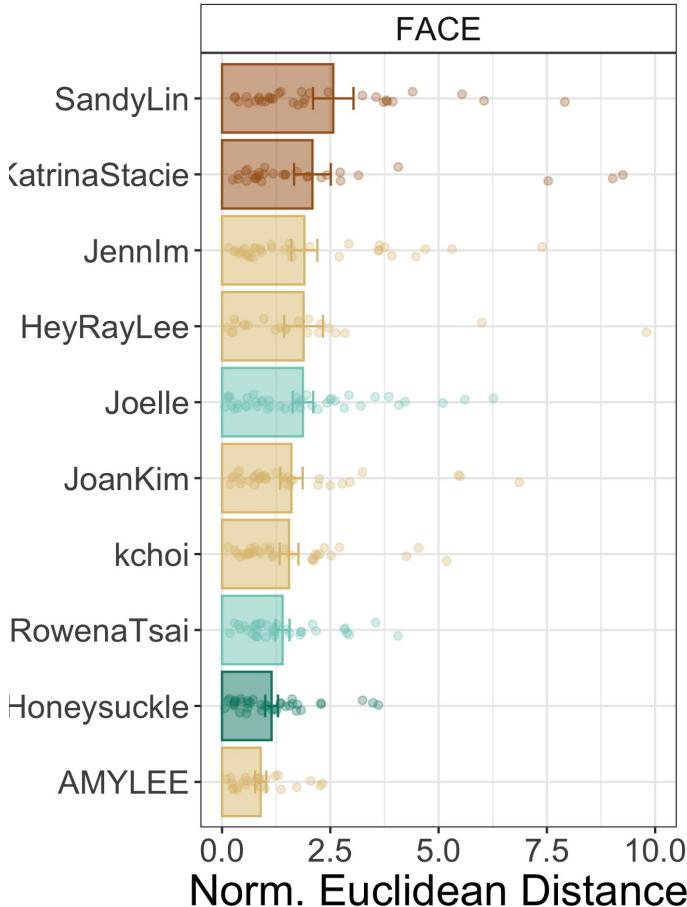
Individual Data: Monophthongization

Speaker



Ethnicity

- chi
- kor
- eas
- viet

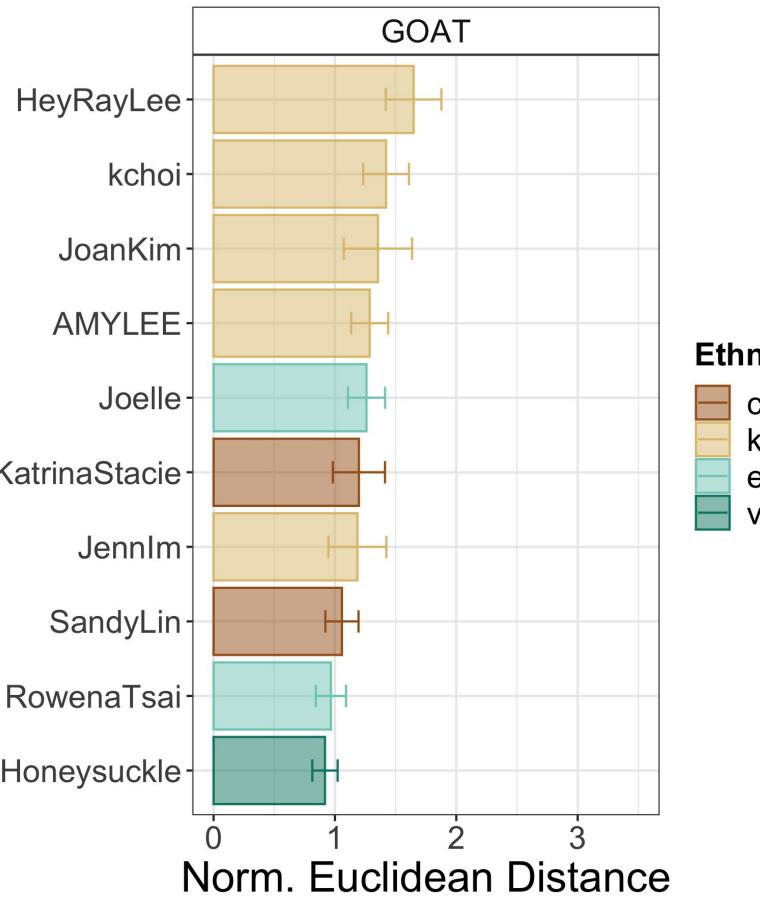


Ethnicity

- chi
- kor
- eas
- viet

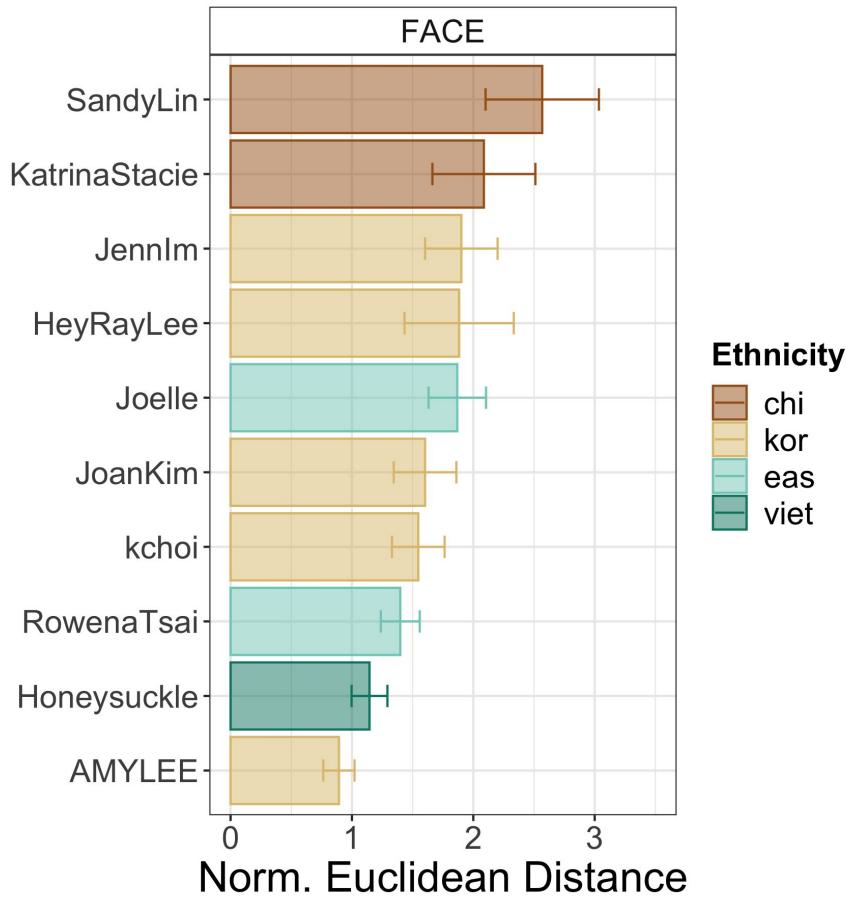
Individual Data: Monophthongization (close up)

Speaker

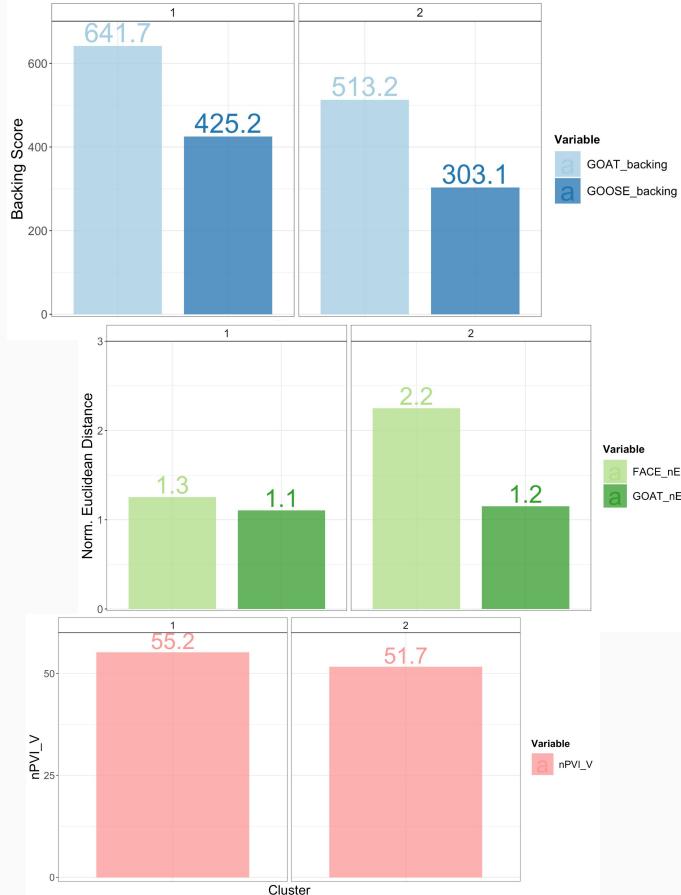
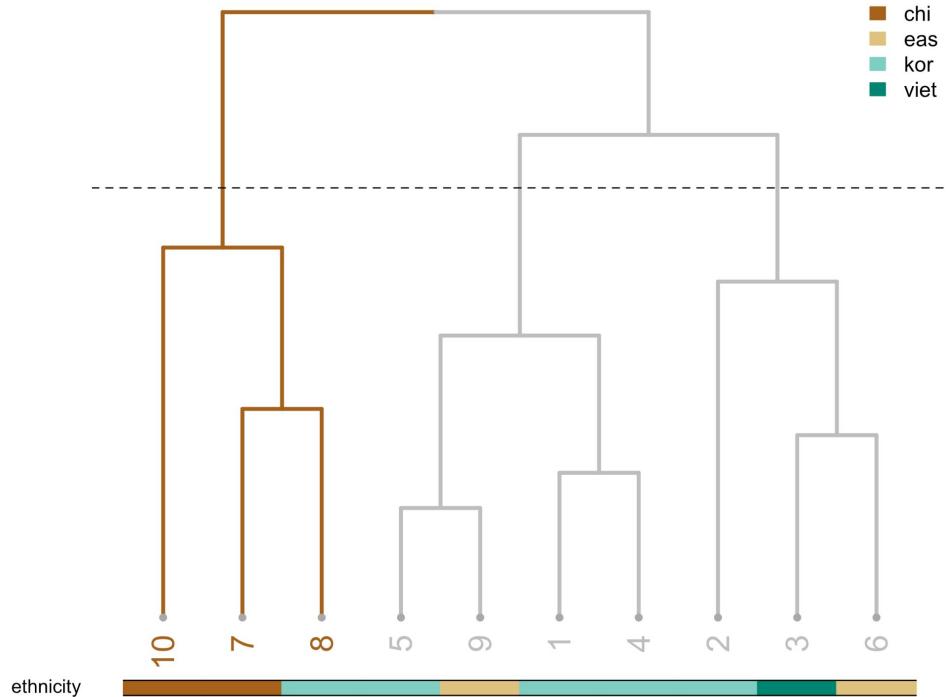


Ethnicity

- chi
- kor
- eas
- viet



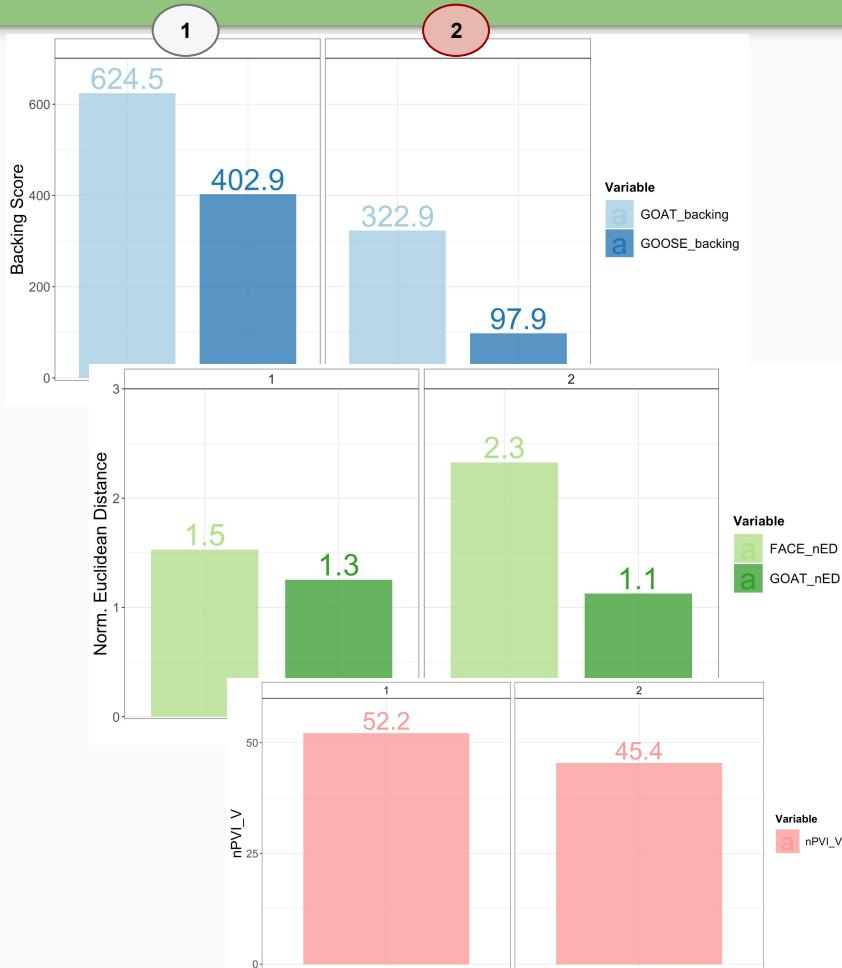
Automatic measures in comparison



ANA Features: Predictions

| Feature | Vowel | Prediction |
|--------------------|---------------------------|--|
| Backing | /oʊ/ (GOAT) | <p>Fronted (higher F2)</p> |
| | /u/ (GOOSE) | <p>Fronted (higher F2)</p> |
| Monophthongization | oʊ/ (GOAT) /eɪ/ (FACE) | <p>Diphthongal (more formant movement)</p> |
| Prosodic rhythm | | <p>“Stress-timed” (more variable vowel duration)</p> |

Clustering Results: Hand-corrected measures (n=10)



| Feature | 1 (mostly Kor-Am) | 2 (Chi-Am) |
|-----------------|---|---|
| GOAT-backing | Very retracted | More fronted (?) |
| GOOSE-backing | More retracted * | Very fronted (?) |
| GOAT-monoph | Similarly diphthongal | Similarly diphthongal |
| FACE-monoph | Less diphthongal | Very diphthongal (*?) |
| Prosodic Rhythm | More “syllable-timed” (more variable duration) | More “stress-timed” (less variable duration) |

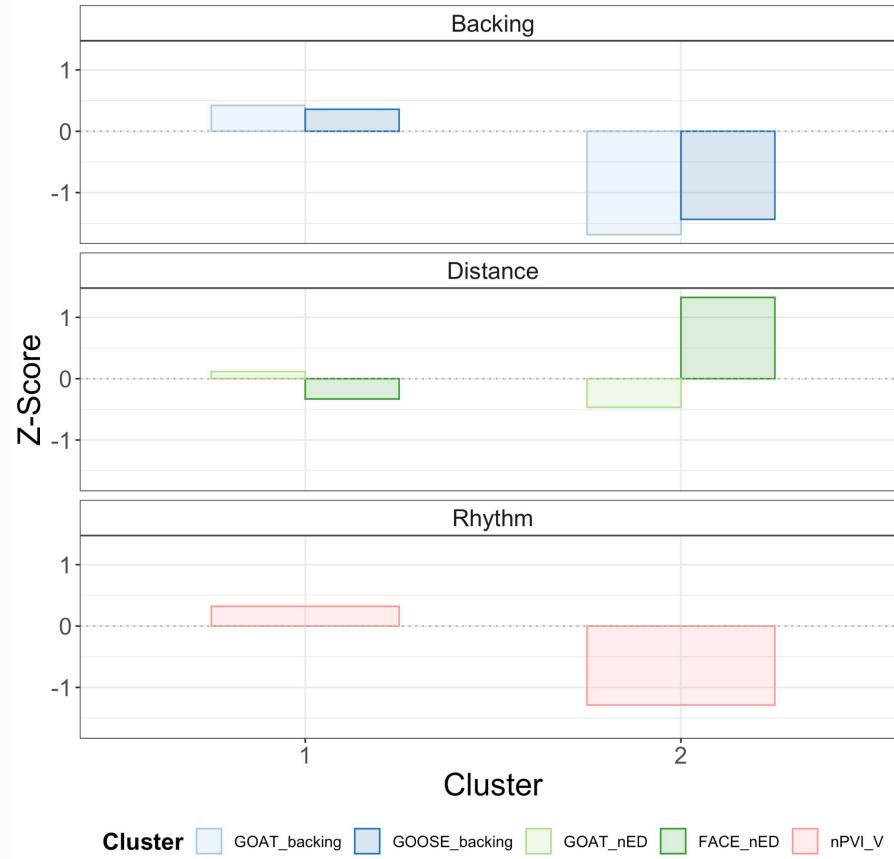
~30-43 for Hispanic speakers (Thomas & Carter, 2006)
 ~33-53 for ANAs (with an average of 43 in Bauman, 2016) or
 ~35-45 (for the Chinese men in Newman & Wu, 2011)
 ~50-55 for White and Black speakers (Thomas & Carter, 2006)

Methods: Variables & Measures

| Feature | Vowel | Measure |
|--------------------|--|--|
| Backing | a. GOAT /ou/ b. GOOSE /u/ | Relative backing score: difference in token F2 from mean FLEECE F2 (<i>higher = more back</i>) |
| Monophthongization | a. GOAT /ou/ b. FACE /ei/ | Norm. Euclidean distance (nED): ED of F1+F2 values at 25% and 75%, divided by token duration (<i>lower = more mono</i>) |
| Prosodic Rhythm | All vowels (durational variability) | Norm. pairwise variability index (nPVI): Average (median) duration difference b/t each pair of vowels, divided by mean pair duration (<i>lower = more “syllable-timed”</i>) |

Results: Hand-corrected measures (n=10)

Cluster Means



ANA Speech in Production

- Most production work has been ethnographic studies on specific communities (e.g.):
 - **Chinese-Americans** in San Francisco (Hall-Lew, 2009), New York City (Wong, 2010), Troy, MI (Zheng, 2018)
 - **Korean-Americans** in New Jersey (Lee, 2016), Houston (Jeon, 2017), California (Cheng, 2020)
 - **Hmong-Americans** in Minnesota (Ito, 2010; Kaiser, 2011)
 - **Vietnamese-American** student association in Minnesota (Nguyen, 2019)
 - **Japanese-Americans** in California (Mendoza-Denton & Iwai, 1993; D'Onofrio & van Hofwegen, 2020)

Features discussed in the ANA literature

| Vowels | Consonants | Suprasegmentals |
|--|-----------------------------------|----------------------------------|
| GOAT-fronting/monophthong (6) | Coda /l/-vocalization (3) | Syllable-timed rhythm (4) |
| COT-CAUGHT merger (6) | /ð/ fortition (2) | High terminal rise/uptalk (2) |
| Vowel space/shifts (4) | Voiceless stop VOT (1) | Pauses/filler words (2) |
| TRAP-fronting/raising/tensing (4) | Post-vocalic /r/ deletion (2) | Breathiness (1) |
| BOUGHT-raising (4) | [t]/[d] coda cluster deletion (1) | Vocal fry (1) |
| BOOT-fronting (3) | Consonant cluster reduction (1) | Higher (average) pitch (1) |
| FACE-backing/monophthong (2) | Onset /r/ quality (1) | <i>Pitch range?</i> |
| TOO-fronting (1) | | <i>Nasality?</i> |

ANA Features: CVS and Fronting/Backing

| Study | |
|------------------------|--|
| Bauman (2016) | ANA women (sorority members) of various ethnic backgrounds from mid-Atlantic region backed GOAT more than others |
| Hall-Lew (2009) | Chinese-Americans in SF fronted GOAT and GOOSE like White Americans |
| A. Cheng et al. (2016) | Korean-Americans from California with backer GOAT and fronted GOOSE compared to White Americans Chinese-Americans with intermediate fronting of GOAT and GOOSE |
| Jeon (2017) | Korean-Americans in Houston back GOAT more, esp. first generation and those with higher ethnic orientation |
| A. Cheng (2020) | Korean-Americans in California back GOAT more, esp. those oriented towards heritage and when talking about Korean topic |

ANA Features: Monophthongization

| Study | |
|----------------------------------|---|
| Bauman (2016) | ANA women (sorority members) of various ethnic backgrounds from mid-Atlantic region produced more monophthongal GOAT |
| D'Onofrio & Van Hofswegen (2020) | Japanese-Americans in California were more monophthongal for GOAT and FACE |

ANA Features: Monophthongization

| Study | |
|-----------------------|---|
| Bauman (2016) | ANA women (sorority members) of various ethnic backgrounds from mid-Atlantic region were relatively syllable-timed |
| Newman & Wu (2011) | Two Chinese-American men in New York with more syllable-timed speech than White, Black and Hispanic men Korean-Americans and Chinese-American women no different from others |
| Zipp & Staicov (2016) | Two Chinese-American women from San Francisco with relatively syllable timed speech , esp. when speaking with an in-group member Two Chinese-American men were no different from stress-timed speakers |

Data: “Growing Up Asian-American” Tag

Tag Questions:

1. Which ethnicity are you?
2. Which generation are you?
3. What is the first experience where you felt that demarcation of being a minority/different?
4. Were you always proud of your heritage or was there a time you rejected it?
5. What are some stereotypes that you struggle with?
6. Can you speak your language?
7. How has being Asian American affected your relationship with your parents?
8. How do you feel about your heritage now? Do you identify with it?
9. What is your favorite thing about being Asian American/your heritage?



Data: Speaker Info/Demographics

- 45 speakers/videos
 - Out of 54 GUA tag videos, removed 1 non-English, 5 multi-speaker, 3 partials
- Limitations/Considerations:
 - Limited variety of regional locations
 - East Asian and southeast Asian only
 - Majority born in U.S. to immigrant parents (i.e., 2nd gen.), but some 1.5 gen, 3/5 gens, adopted
 - Large majority present as women
 - Genre most likely to be lifestyle and beauty vloggers
 - Likely only includes those who are more oriented towards ethnic identity

| Regional location (childhood) | Ethnic identification | |
|----------------------------------|-----------------------|---|
| California | Korean | 9 |
| <i>unknown</i> | Filipino | 9 |
| New York | Chinese | 8 |
| Virginia | Vietnamese | 4 |
| Oregon | Taiwanese | 3 |
| Ontario? | Malaysian Chinese | 1 |
| New Jersey | Malaysian | 1 |
| Texas | Lao | 1 |
| Ohio | Korean-White | 1 |
| Minnesota | Japanese-Korean | 1 |
| Massachusetts | Japanese | 1 |
| Illinois | Indonesian-Chinese | 1 |
| Florida | Indonesian | 1 |
| Connecticut | Chinese-Vietnamese | 1 |
| | Chinese-Korean | 1 |
| | Cambodian-Chinese | 1 |
| | Cambodian | 1 |

Clustering Analysis

- Based on silhouette diagnostic method, selected k=2 (clusters)
 - With only 6 individuals, not very reliable!
- Hierarchical clustering on **5 key variables** of interest:
 - i. GOAT-fronting (norm. Backing Score)
 - ii. GOOSE-fronting (norm. Backing Score)
 - iii. GOAT-monophthongization (norm. Euclidean Distance)
 - iv. FACE-monophthongization (norm. Euclidean Distance)
 - v. Syllable-timed rhythm (nPVI)

Analysis: Ideas

1. Are there clusters of ANA-identifying speakers with shared/similar phonetic features?

What clusters occur in the data? Can these be characterized by ethnic or regional identification, or the interaction?

2. What phonetic features are shared across ANA-identifying speakers?

For a specific feature (e.g., syllable timed rhythm), do we see similarities across ethnic or pan-ethnic groups?

How do ANA speakers compare to speakers of other ethnic backgrounds from the same regions?

3. (Does ethnic orientation/rootedness correlate with use of ANA ethnolinguistic features?)

Data: Speaker Info

- 66 total speakers (46 ANA, 20 non-ANA)
 - 35 Californian (25 ANA, 10 non-ANA)

| Regional location (childhood) | Ethnic identification | |
|----------------------------------|-----------------------|----|
| California | Chinese | 11 |
| NA | Korean | 9 |
| Texas | Vietnamese | 8 |
| Washington | Filipino | 6 |
| Oregon | Taiwanese | 3 |
| Virginia | Japanese | 2 |
| Toronto, Canada | Vietnamese-Chinese | 1 |
| Pennsylvania | Malaysian | 1 |
| New York | Lao | 1 |
| New Jersey | Japanese-Korean | 1 |
| Illinois | Indonesian | 1 |
| Connecticut | Chinese-Korean | 1 |
| Alberta, Canada | Cambodian | 1 |

Questions for you

- What other literature may be relevant to background, framing and interpretation?
- Are there considerations we should take into account?
- Feedback/ideas for analysis: What kinds of analyses make sense?
 - Comparison groups? (e.g., tags comparable to GUA?)
 - How to code/assess ethnic orientation?
 - Thoughts on local/regional category? (e.g., California vs. other? North vs South California?)
- Suggestions/advice/help for data processing and phonetic analyses
 - Efficient ways to detect problems and clean data? (e.g., background music, multiple speakers...)
 - Other tools that might be relevant? (e.g., Praat scripts, other forced aligners...)
 - Analysing prosodic/suprasegmental information? (e.g., uptalk, voice quality)
- Future directions/ideas
 - Download videos to include with corpus? Would that be relevant to some research?
 - Extensions to morphosyntactic/other features?